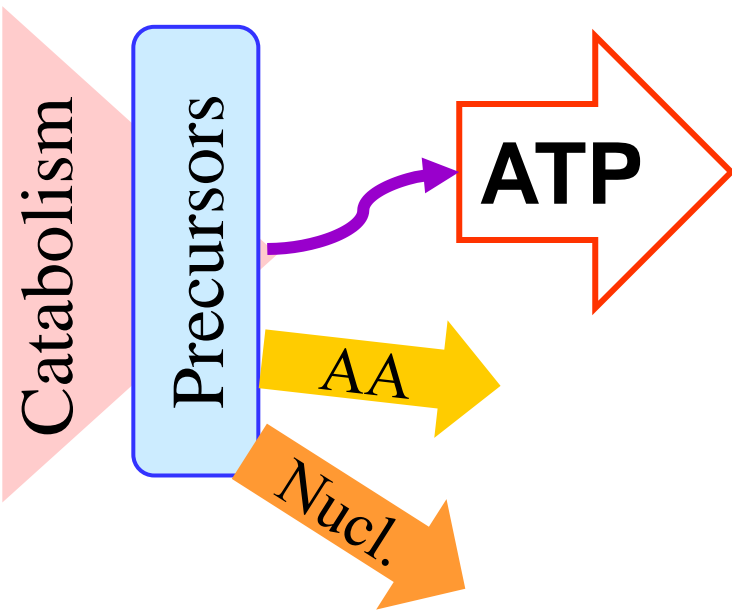
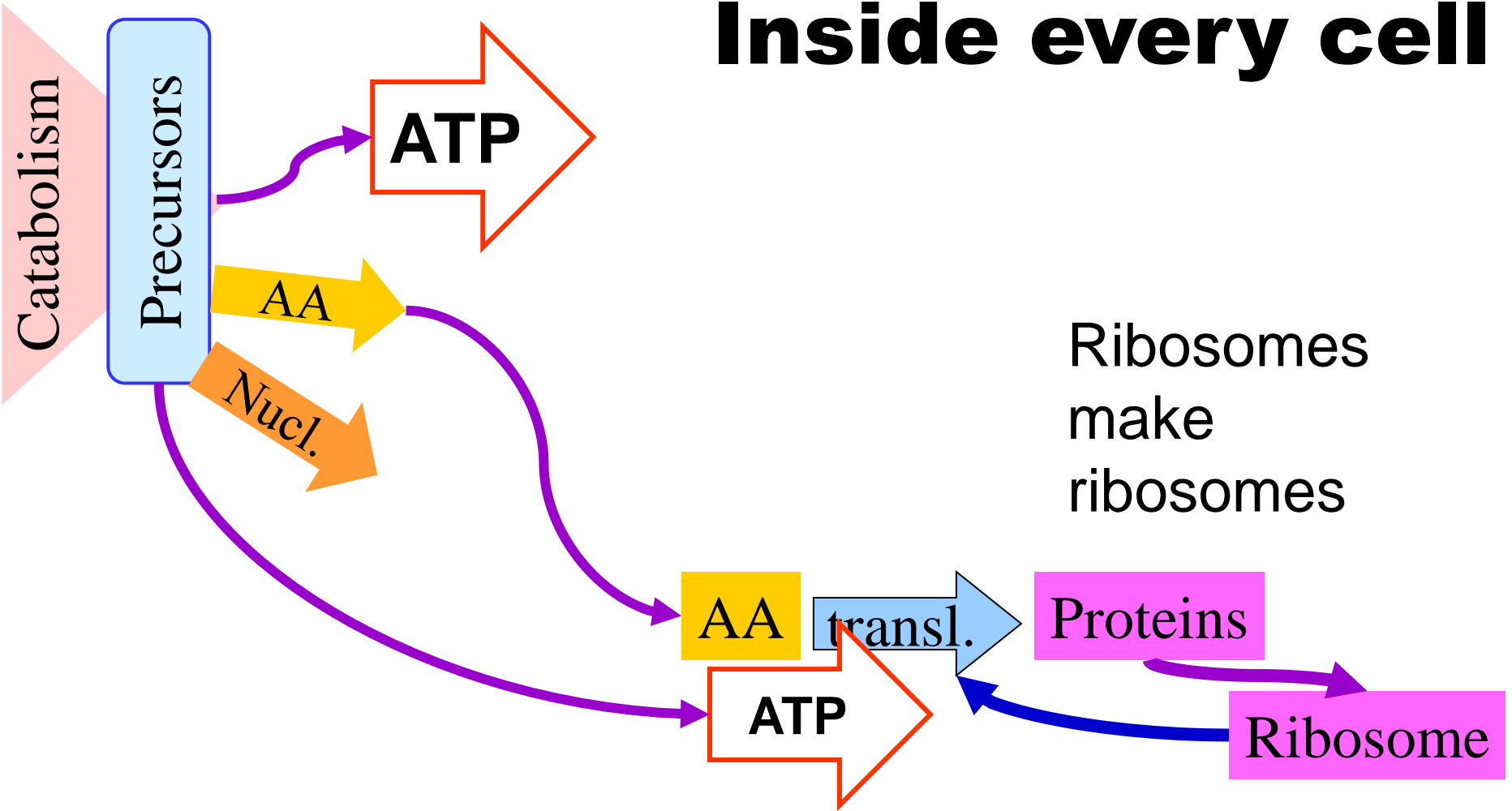


Inside every cell



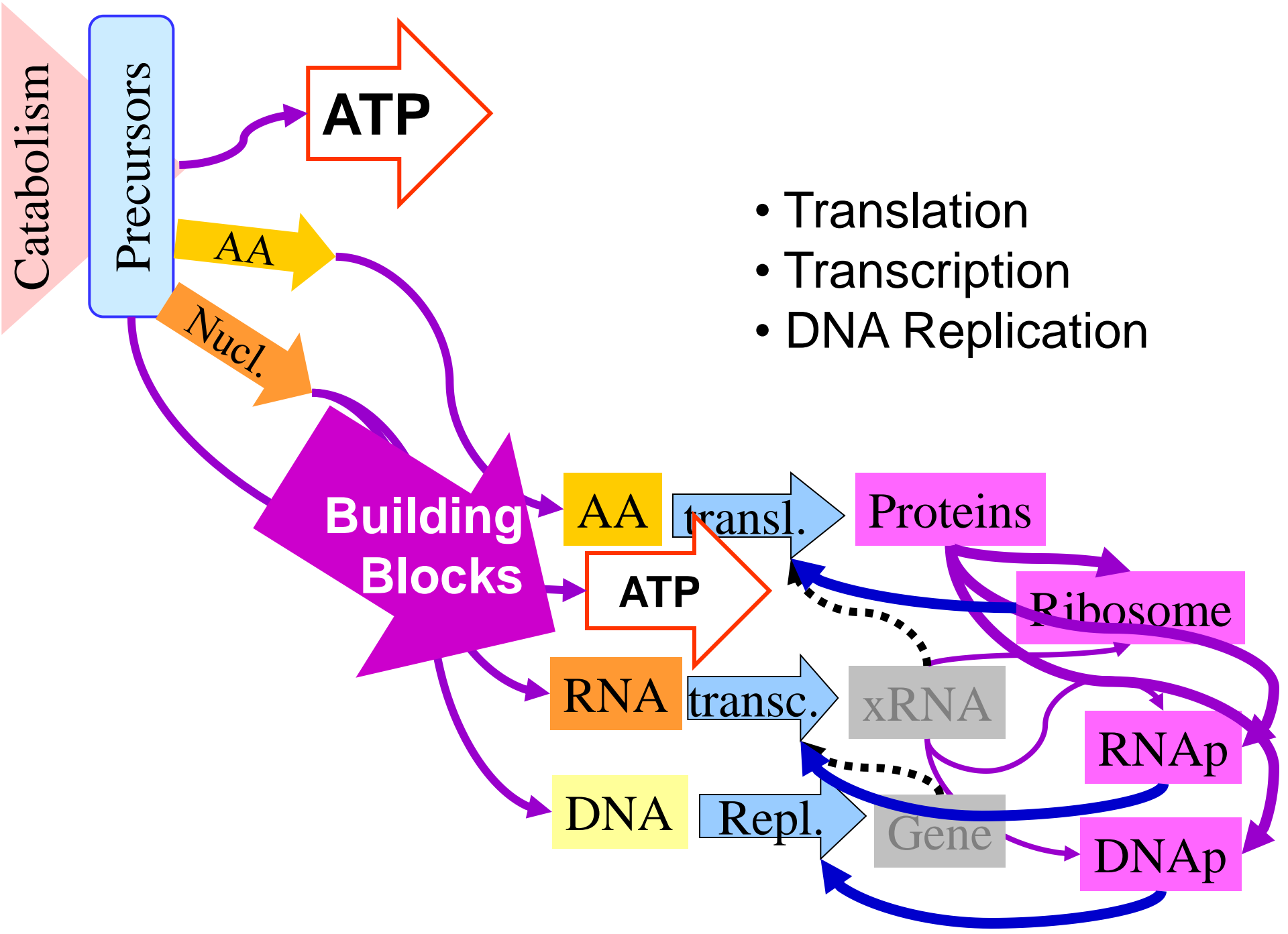
- **Autocatalytic feedback (essential)**
- Efficient processes
 - Minimal enzymes (lean manufacturing)
 - Long assembly process (simple steps)
- Limited control feedback

Inside every cell

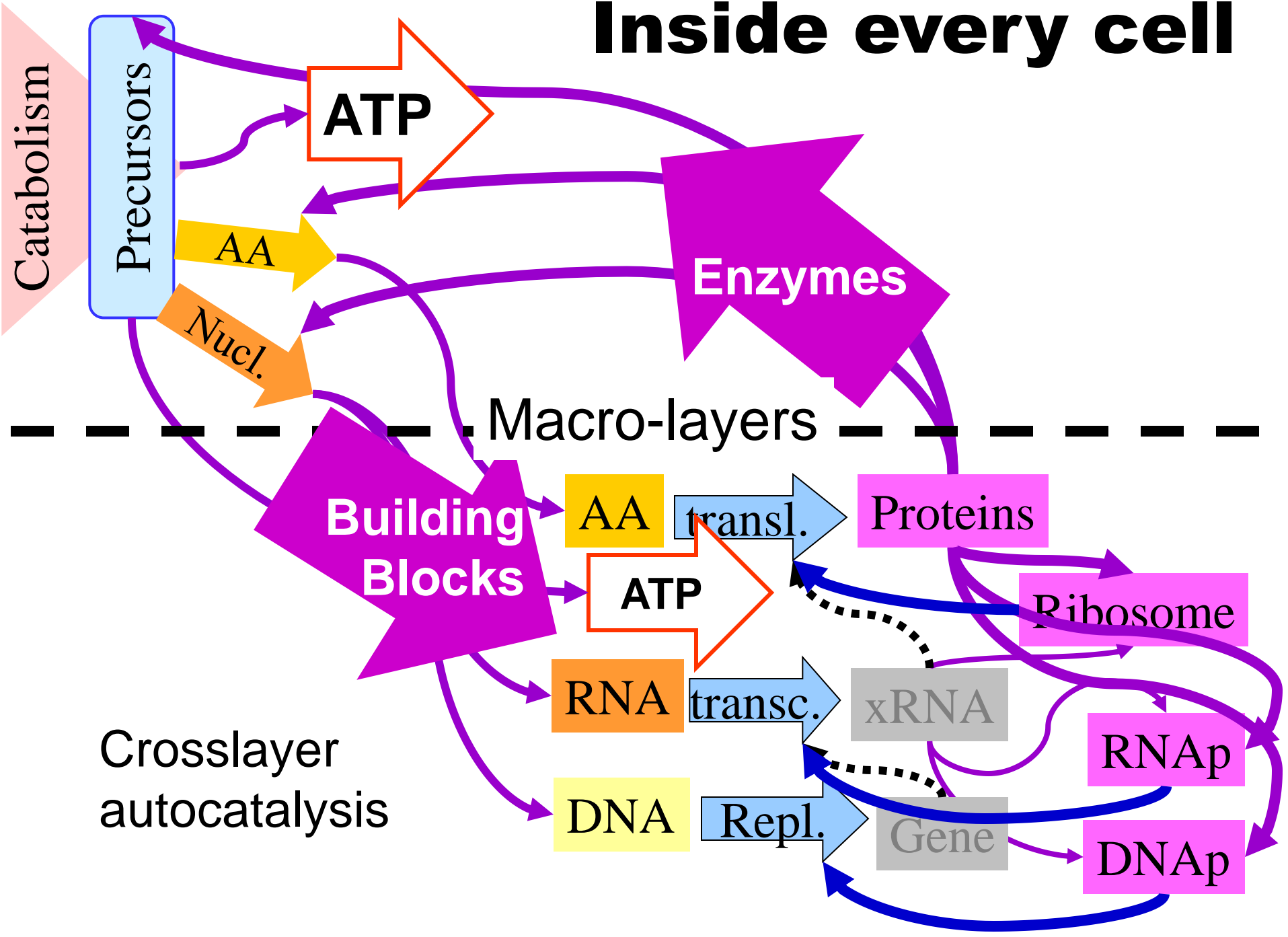


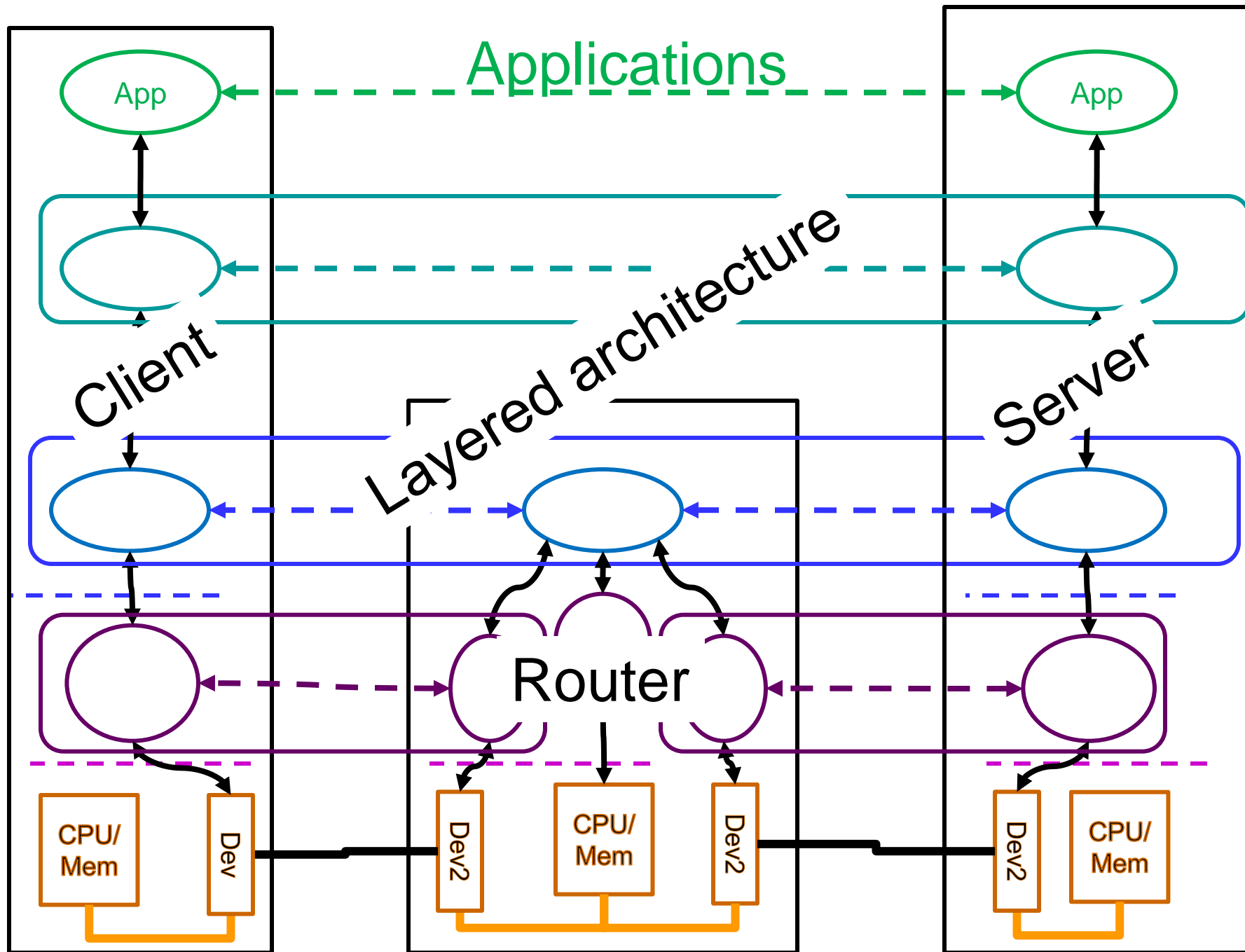
Ribosomes
make
ribosomes

Translation: Amino acids
polymerized into proteins

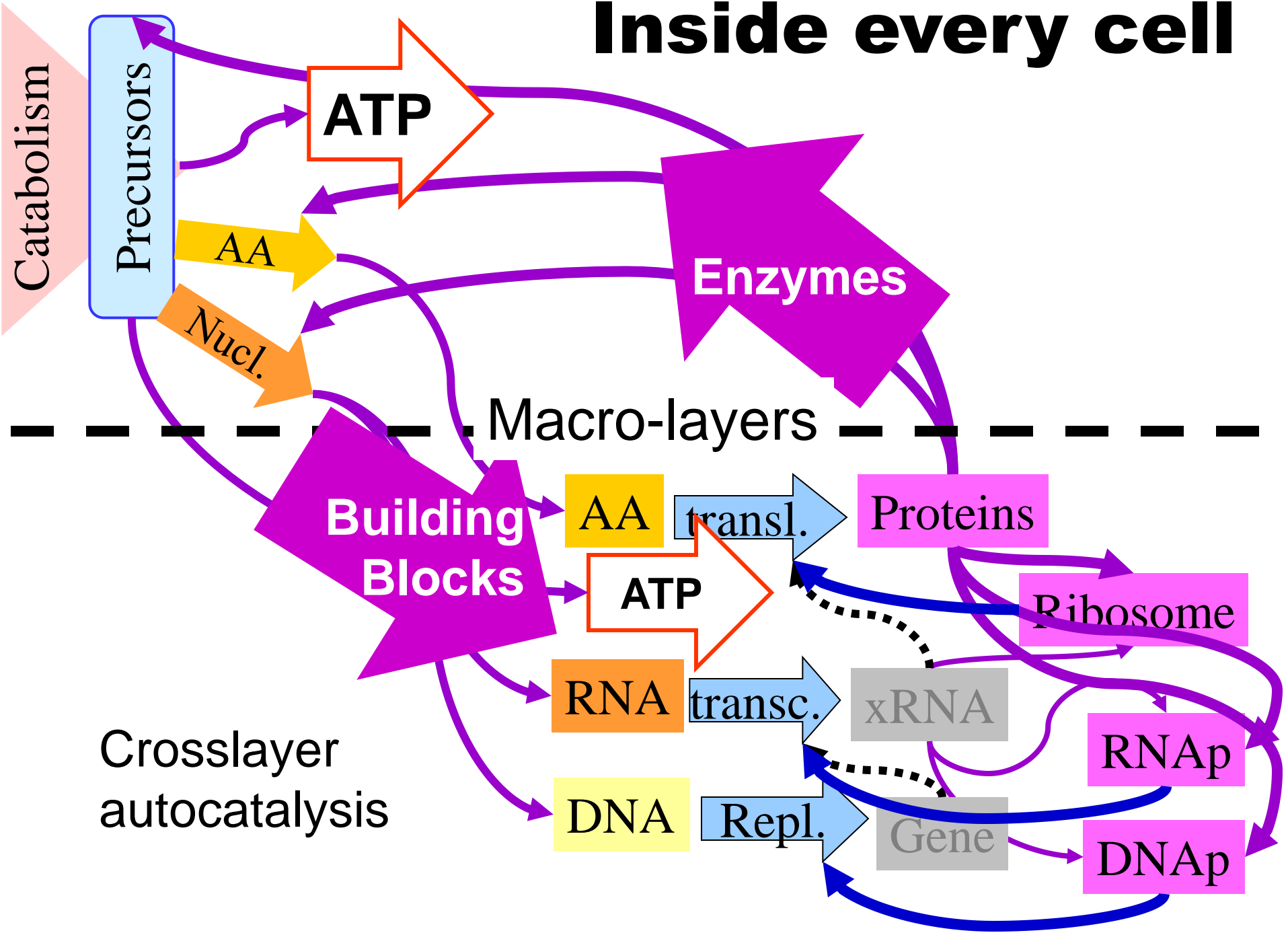


Inside every cell





Inside every cell

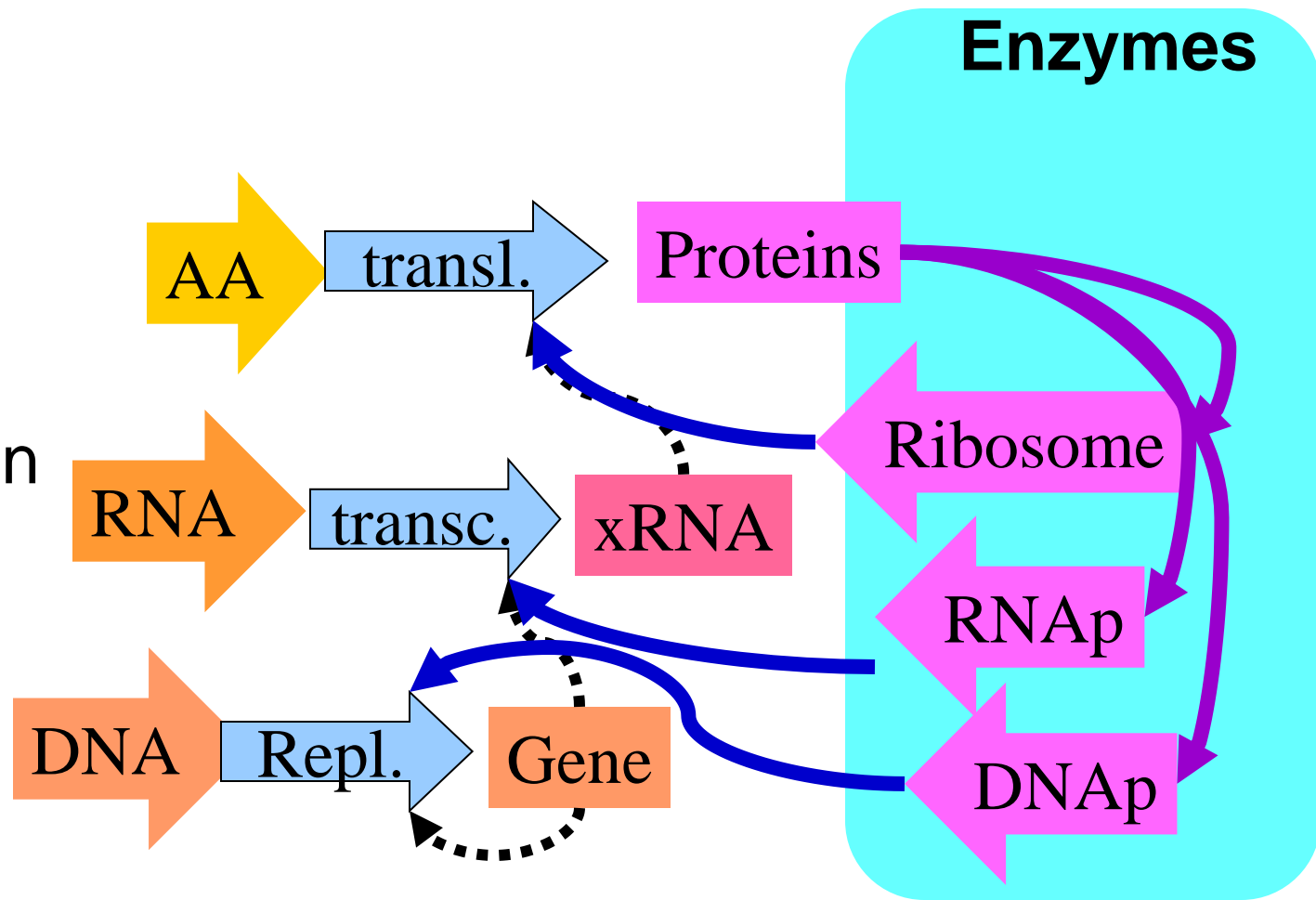


Lower layer autocatalysis

Macromolecules making ...

Three lower layers? Yes:

- Translation
- Transcription
- Replication



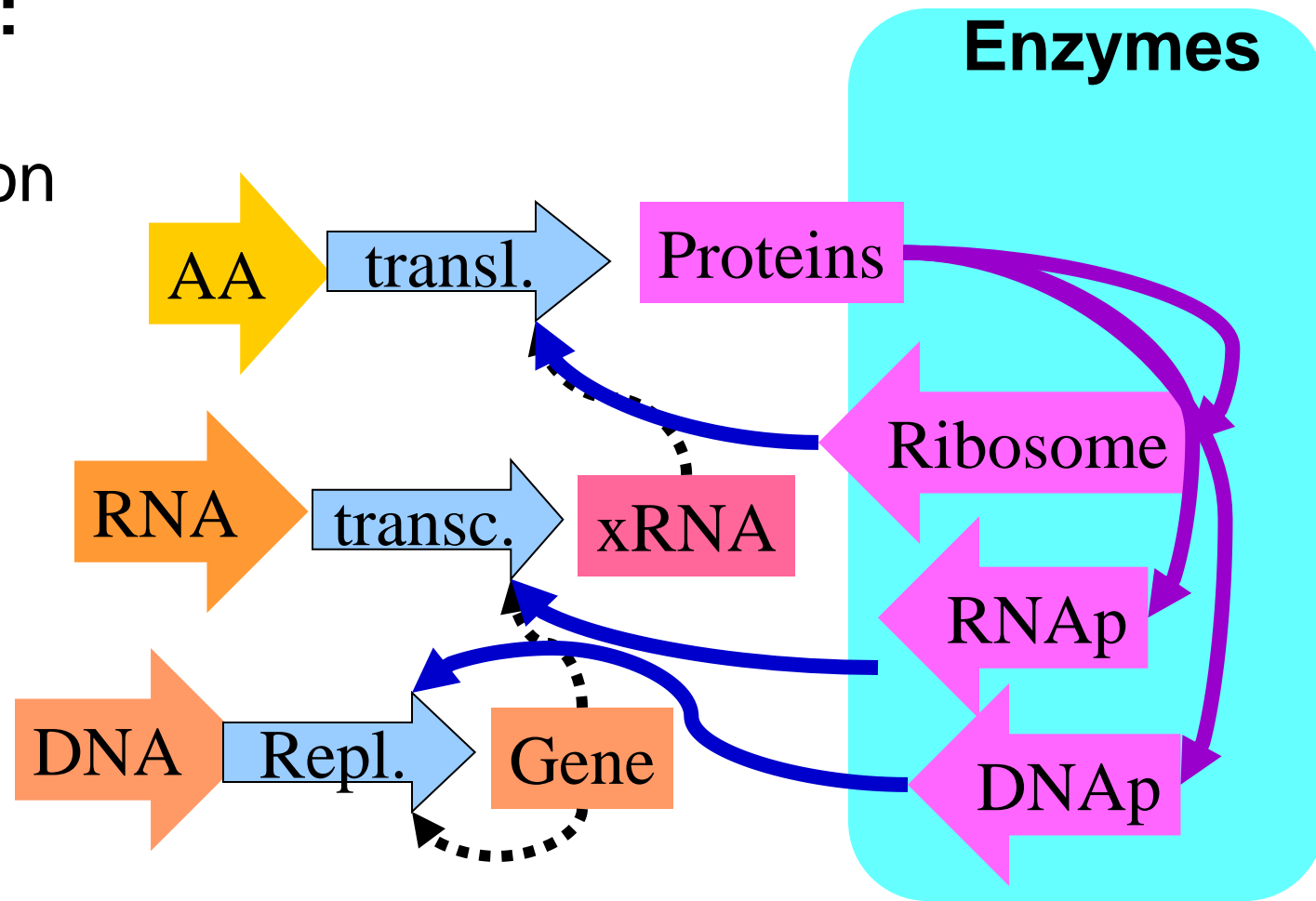
Autocatalytic within lower layers

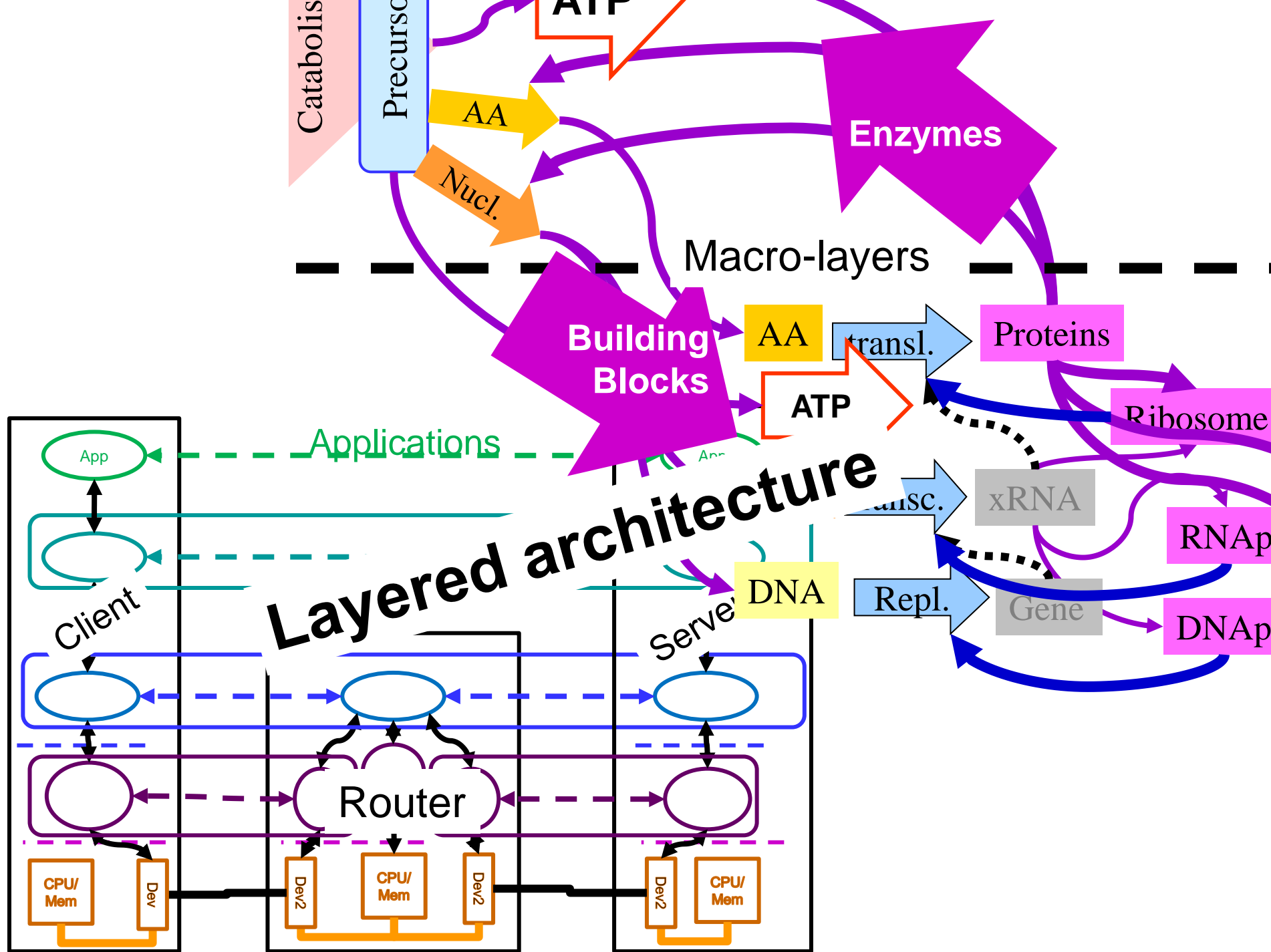
- Collectively self-replicating
- Ribosomes make ribosomes, etc

Three lower layers? Yes:

- Translation
- Transcription
- Replication

Naturally recursive



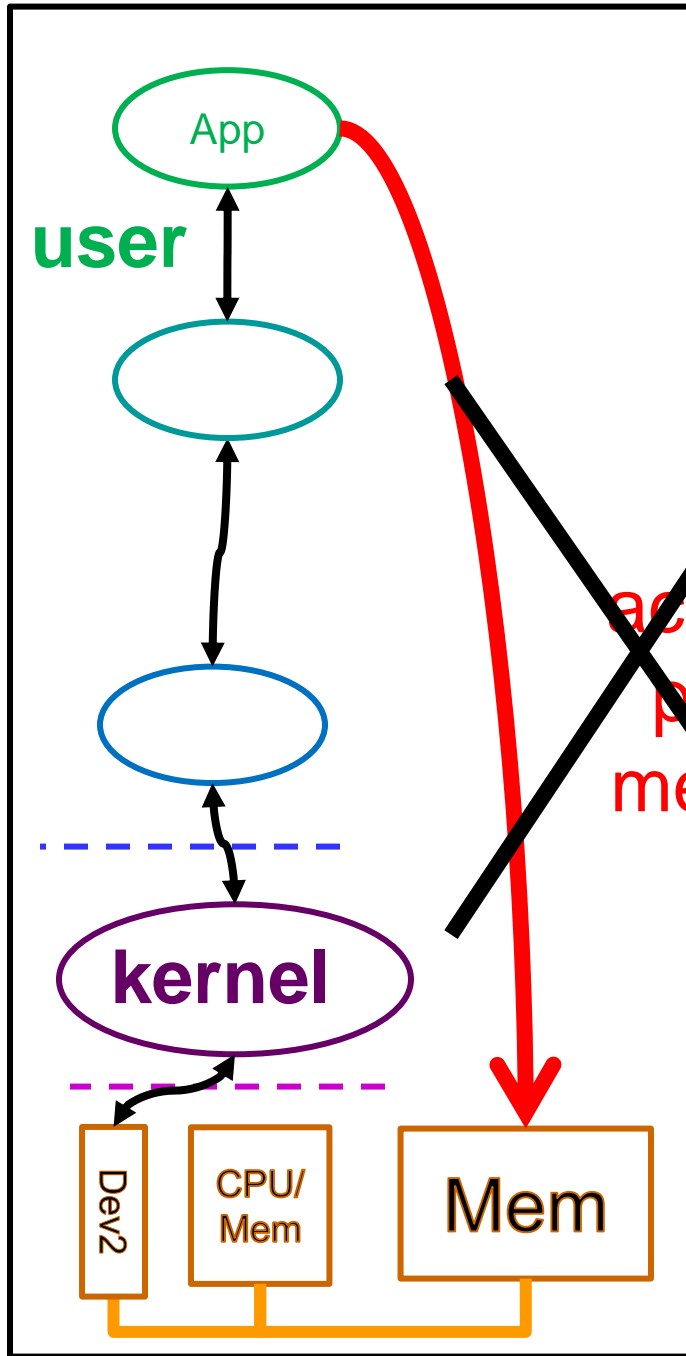


Naming and addressing

- Names needed to locate objects
- 2.5 ways to resolve a name
 1. Exhaustive search, table lookup
 2. Name gives hints
- Extra $\frac{1}{2}$ is for indirection
- Address is just a name that involves locations

Operating systems

- OS allocates and shares diverse resources among diverse applications
- Clearly separate (disaster otherwise)
 - Application name space
 - Logical (virtual) name/address space
 - Physical (name/) address space
- Name resolution within applications
- Name/address translation across layers



**In operating systems:
Don't cross layers**

**Direct
access to
physical
memory?**

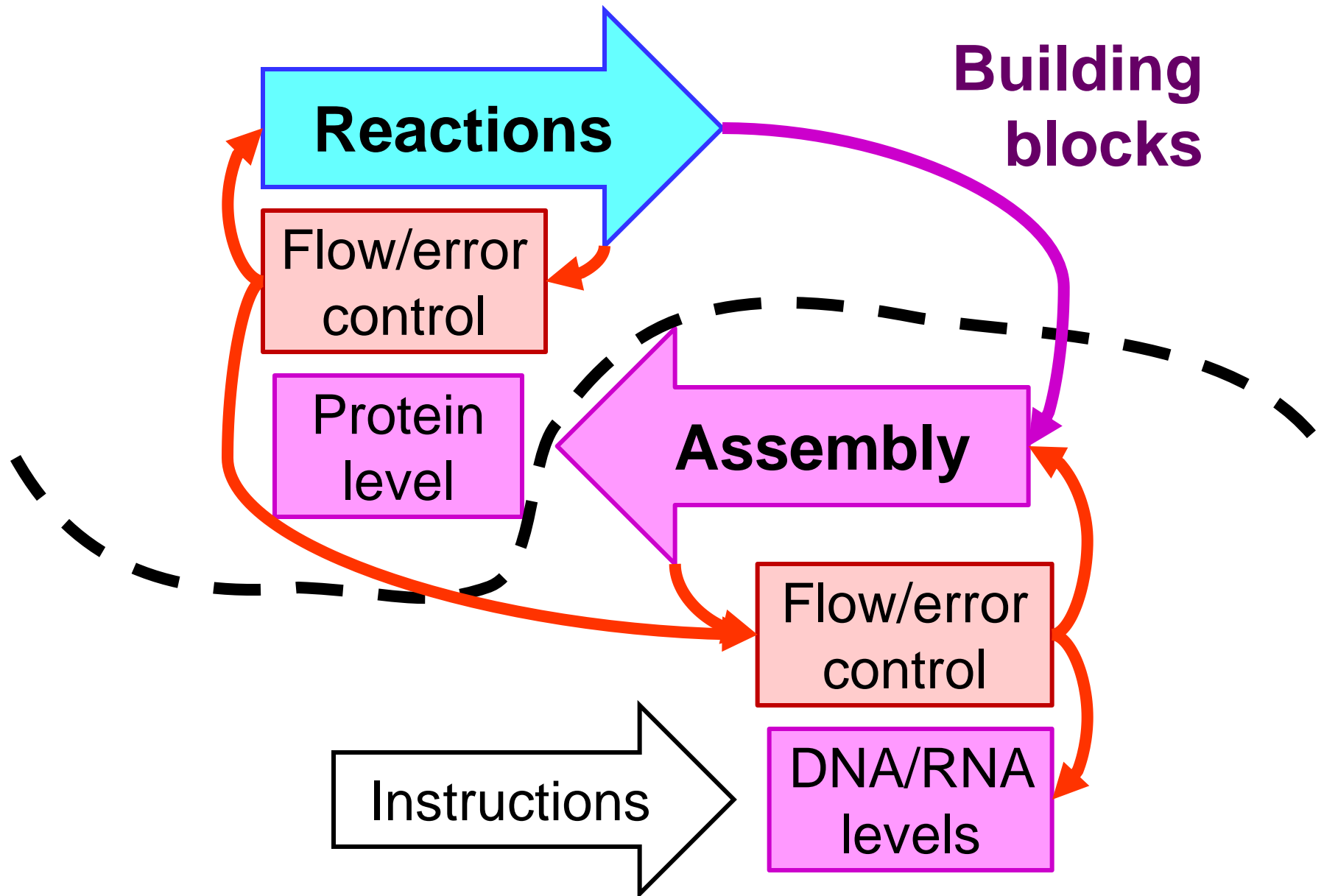
Benefits of stricter layering

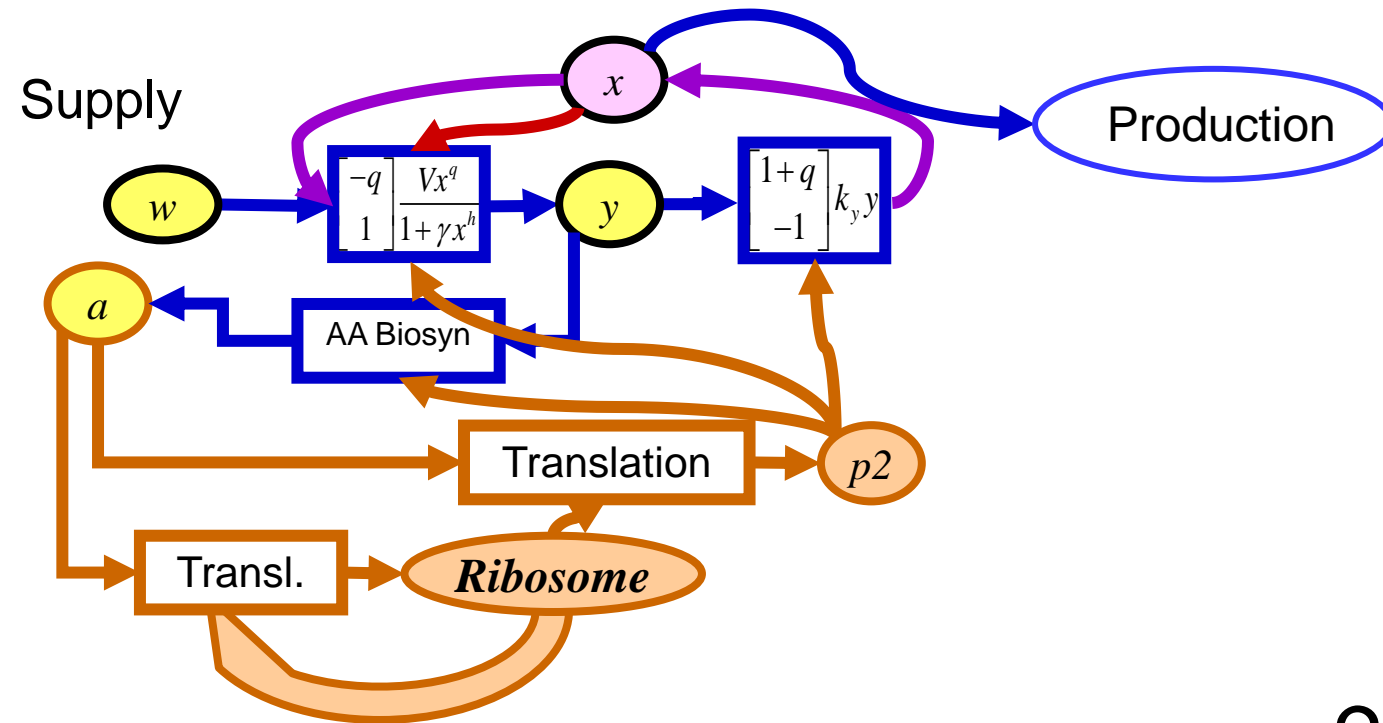
“Black box” effects of stricter layering

- Portability of applications
- Security of physical address space
- Robustness to application crashes
- Scalability of virtual/real addressing
- Optimization/control by duality?

Bacterial architecture

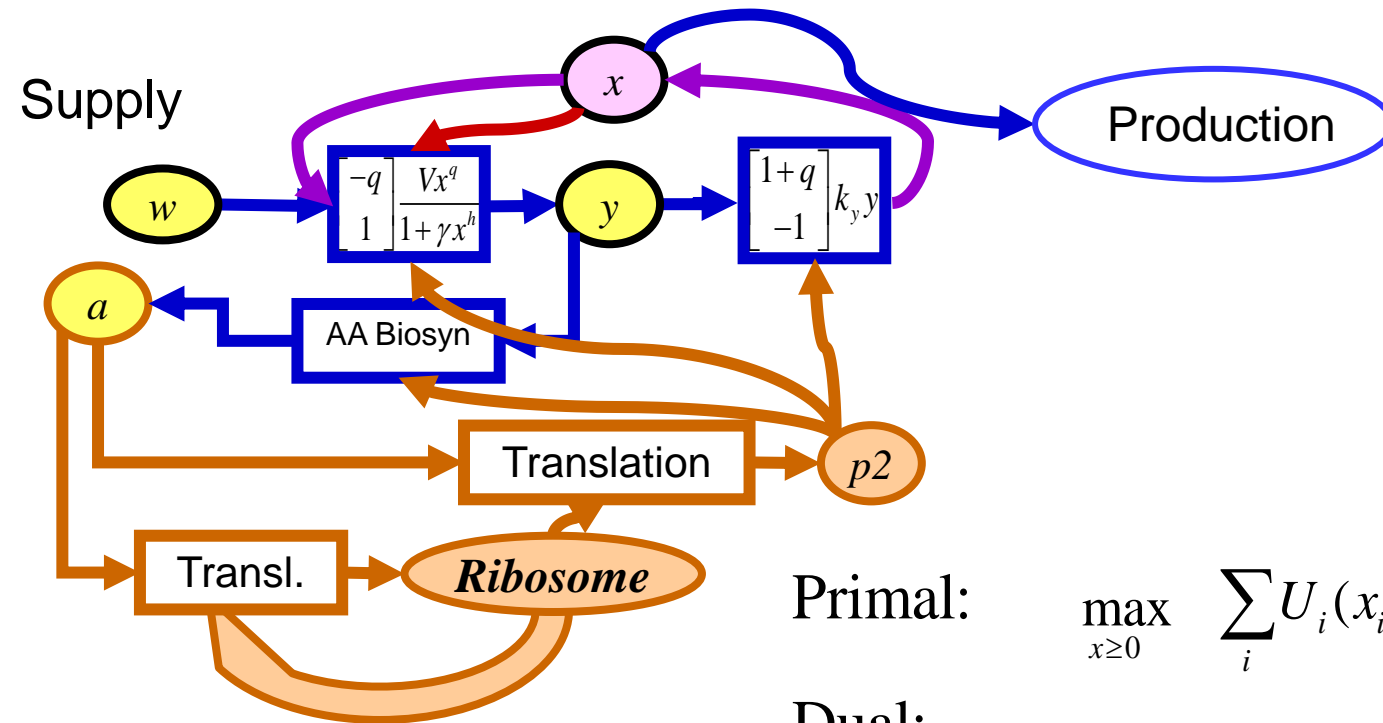
- More complex macro-layering of function
 - Upper: Metabolism, envelope, signaling, building blocks
 - Lower: Proteins & macromolecule synthesis, replication
- Cleaner layering of control
 - Transcription factors
 - 2 component signal transduction
- Name/address resolution
 - Global, exhaustive by fast diffusion within layers
 - Highly structured interactions between layers
- Limited scalability
 - Limited to small volumes
 - Control proteins scale super-linearly with enzyme numbers



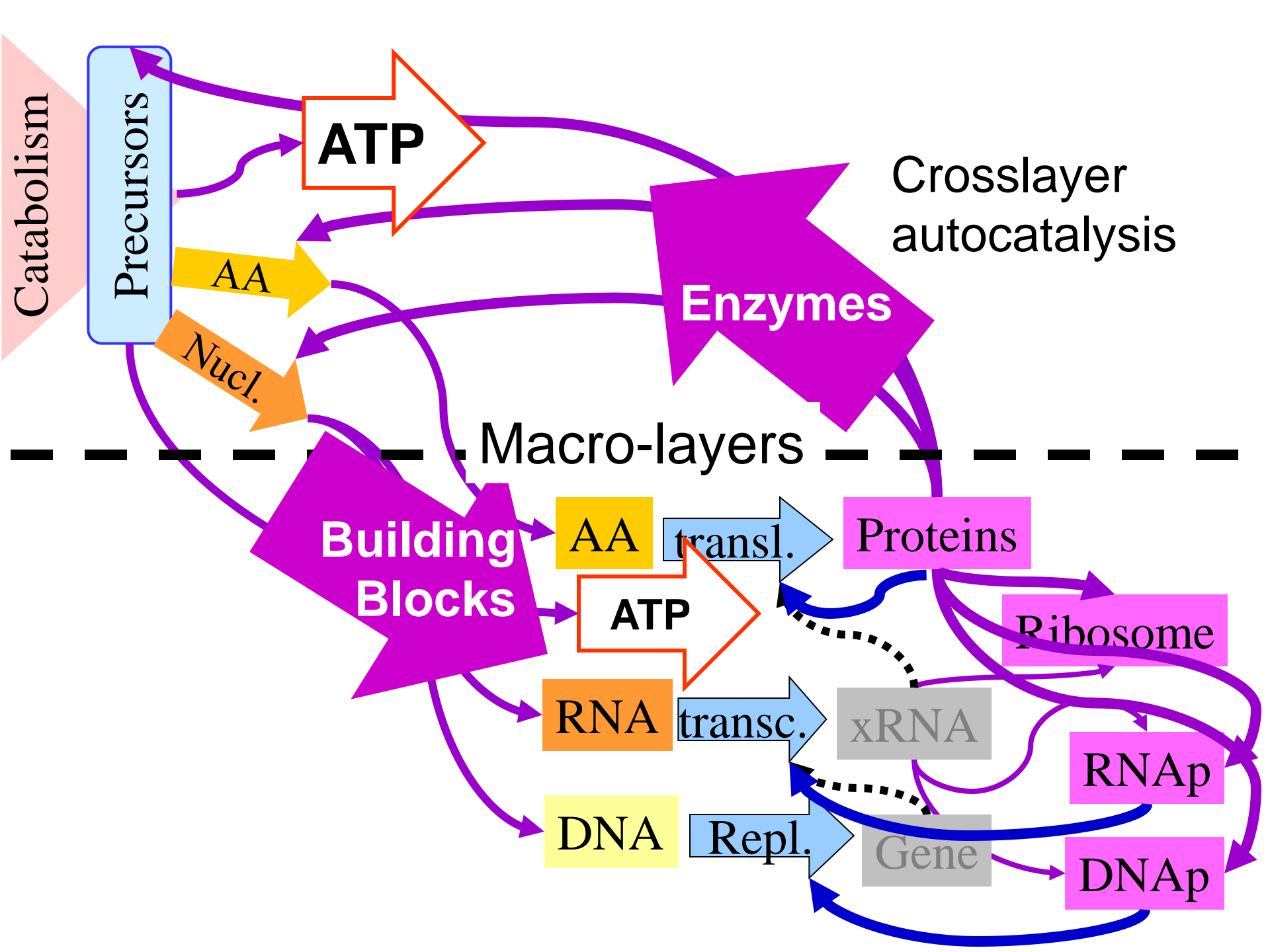


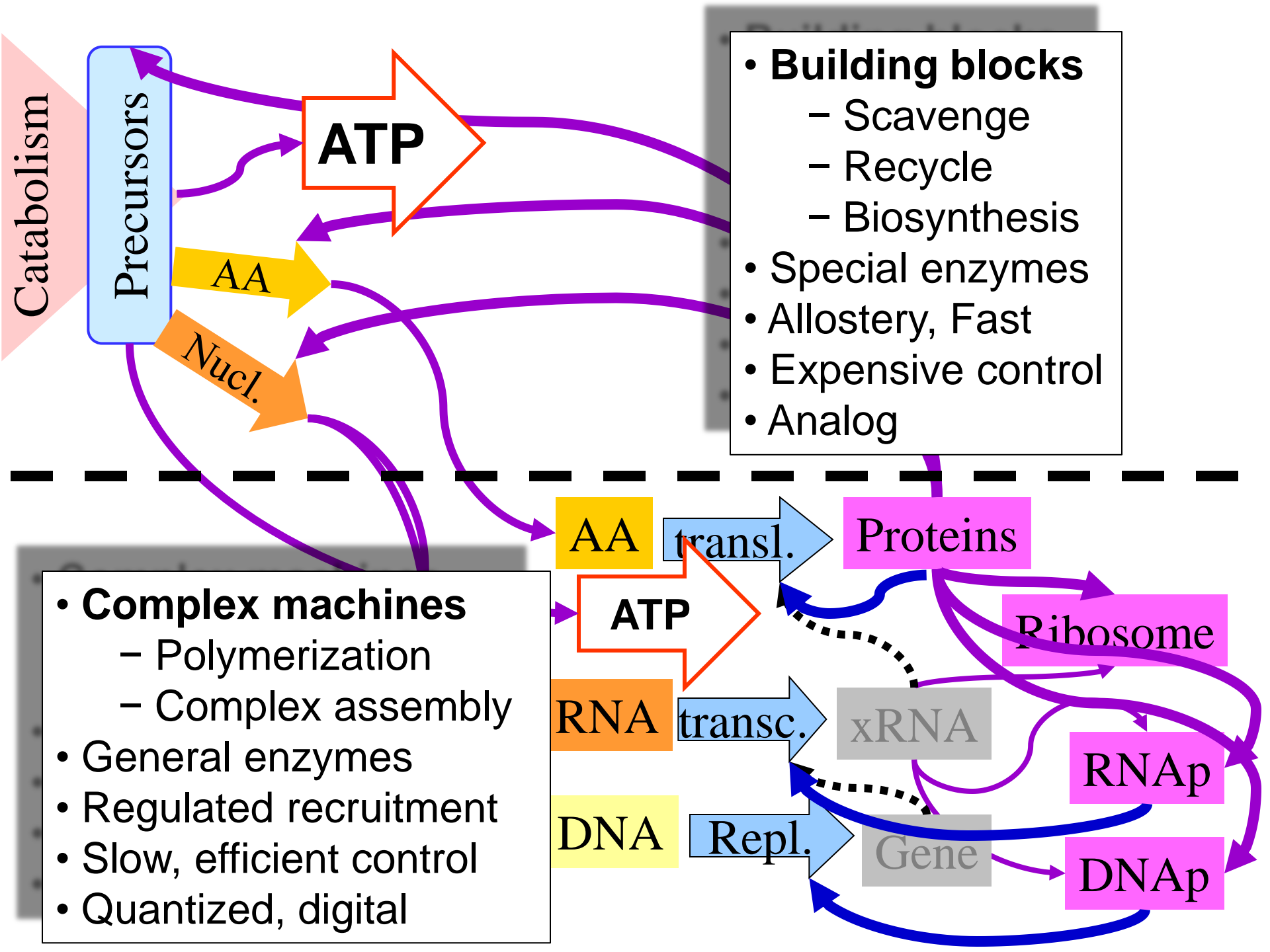
Does it fit the framework?
Yes, but it takes some explaining and no one has worked out the details.

$$\begin{aligned} \max_{x \geq 0} \quad & \sum_i U_i(x_i) + \sum_l V_l(w_l) \\ \text{subj to} \quad & R(G) x \leq c(w, \mathbf{P}) \\ & x \in C(\mathbf{P}) \end{aligned}$$



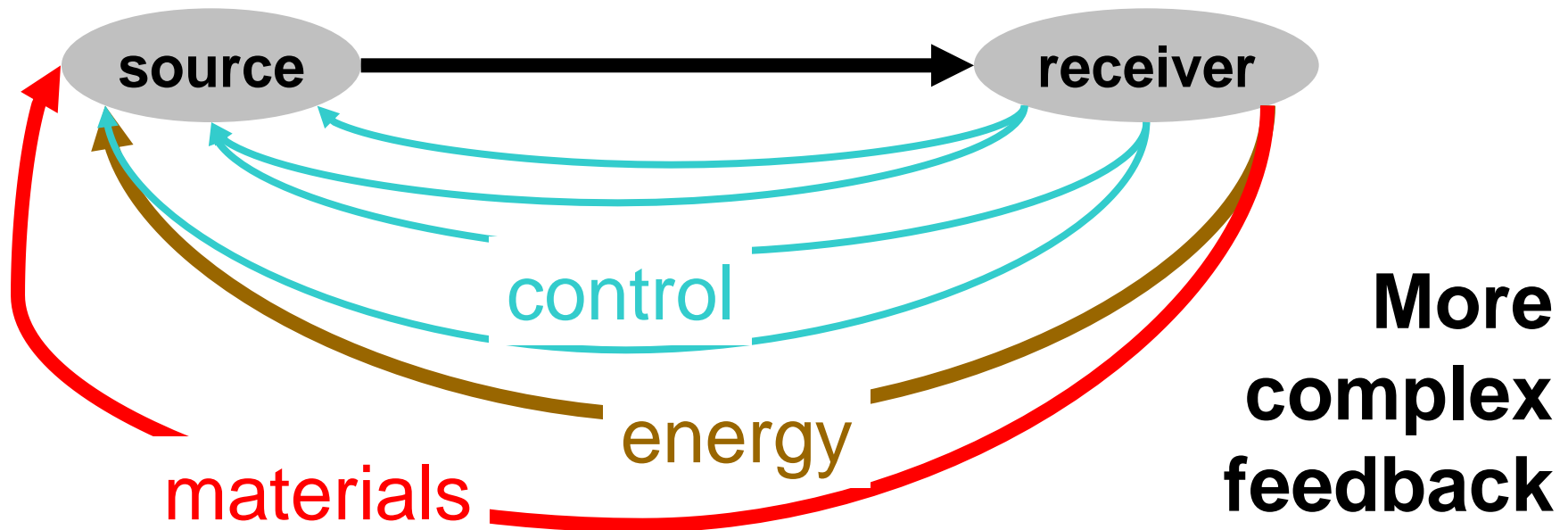
No duality gaps?
 Multipath routing?
 Coherent pricing?

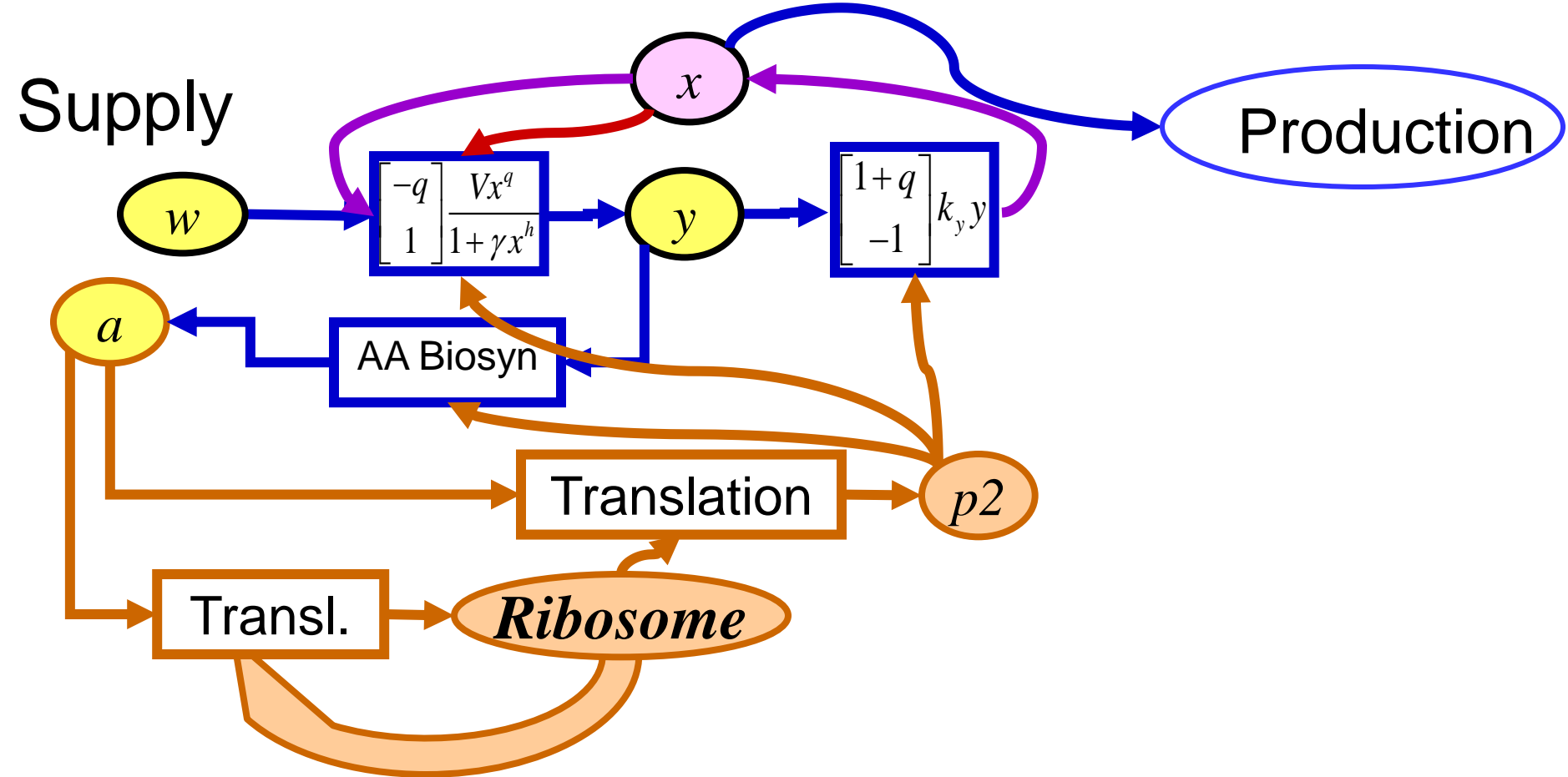




All these other feedbacks make feedback control harder, and in each layer biology appears to cleverly balance competing requirements.

$$\frac{1}{\pi} \int_0^{\infty} \ln |S(j\omega)| \frac{z}{z^2 + \omega^2} d\omega \geq \ln \left| \frac{z+p}{z-p} \right|$$





Main problem with autocatalytic networks

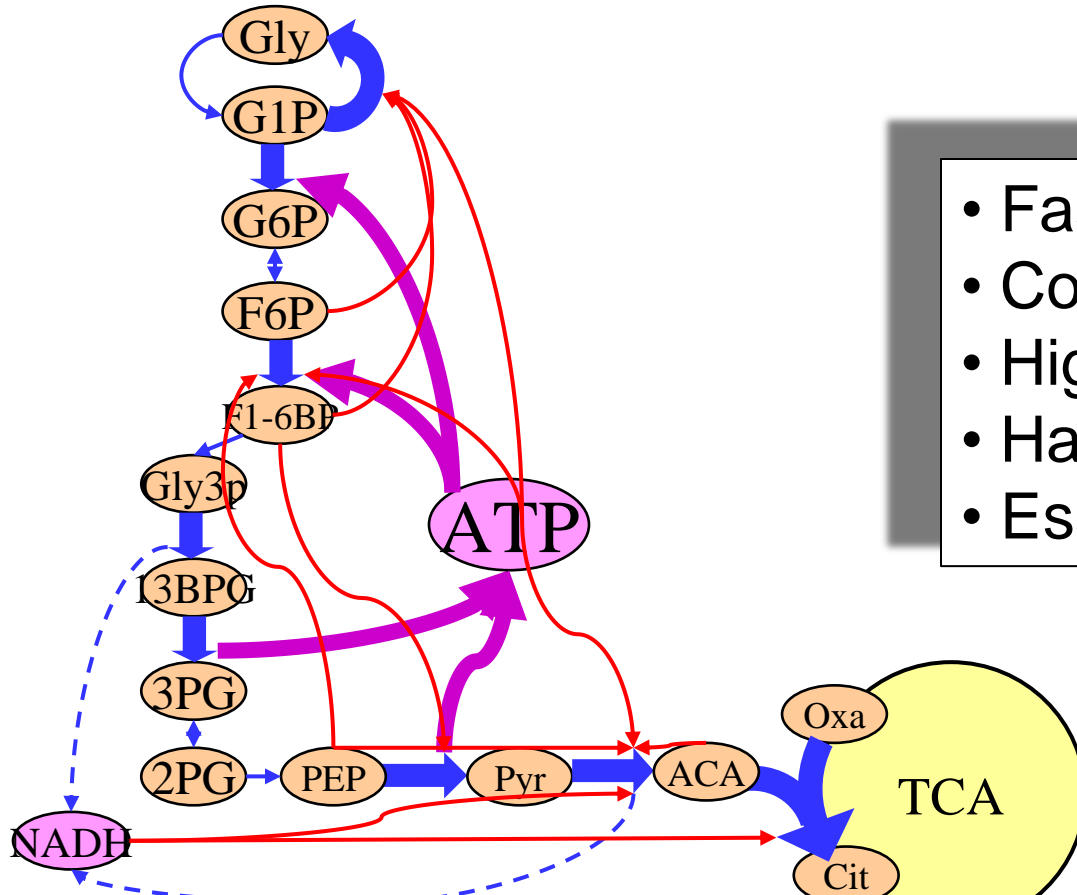
- Maximize production, but
- Balance risk to fluctuating supply
- (or control for fluctuating demand)

Catabolism

Precursors

ATP

Upper layer autocatalysis

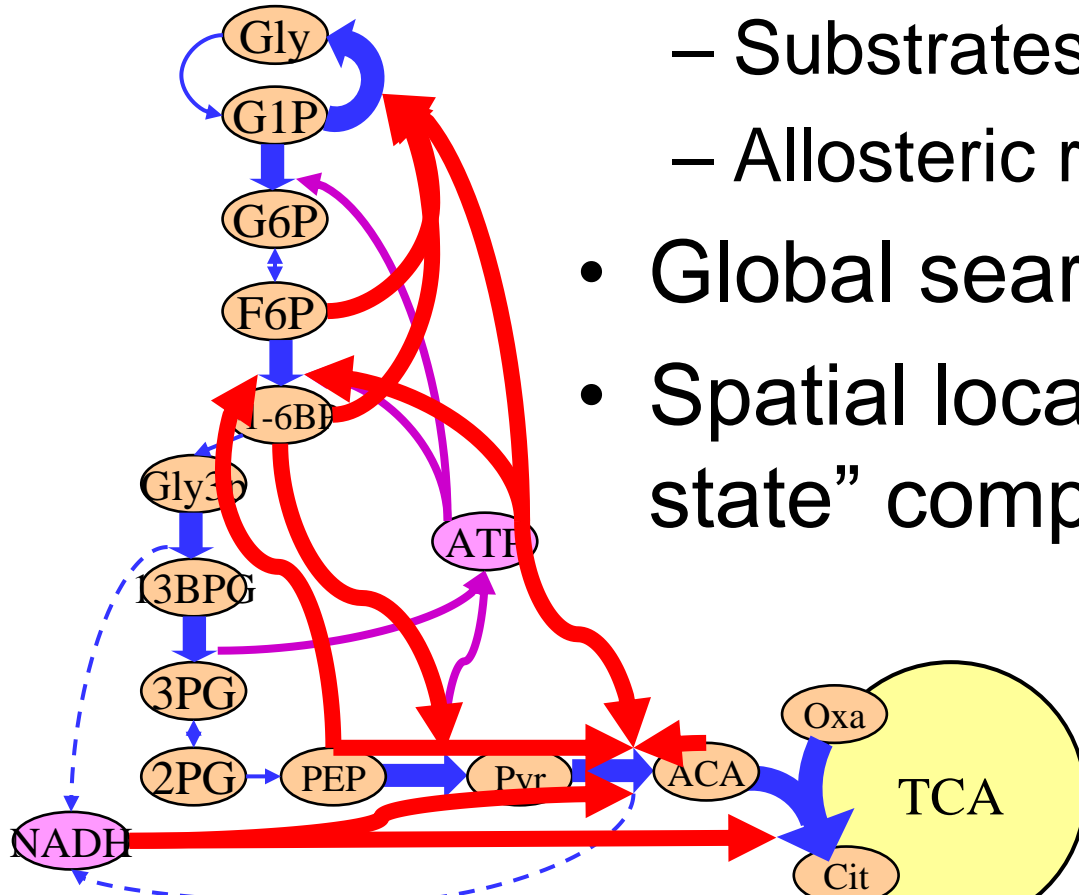


- Fastest allosteric control
- Complex proteins
- High metabolic overhead
- Hard to reprogram
- Essentially analog

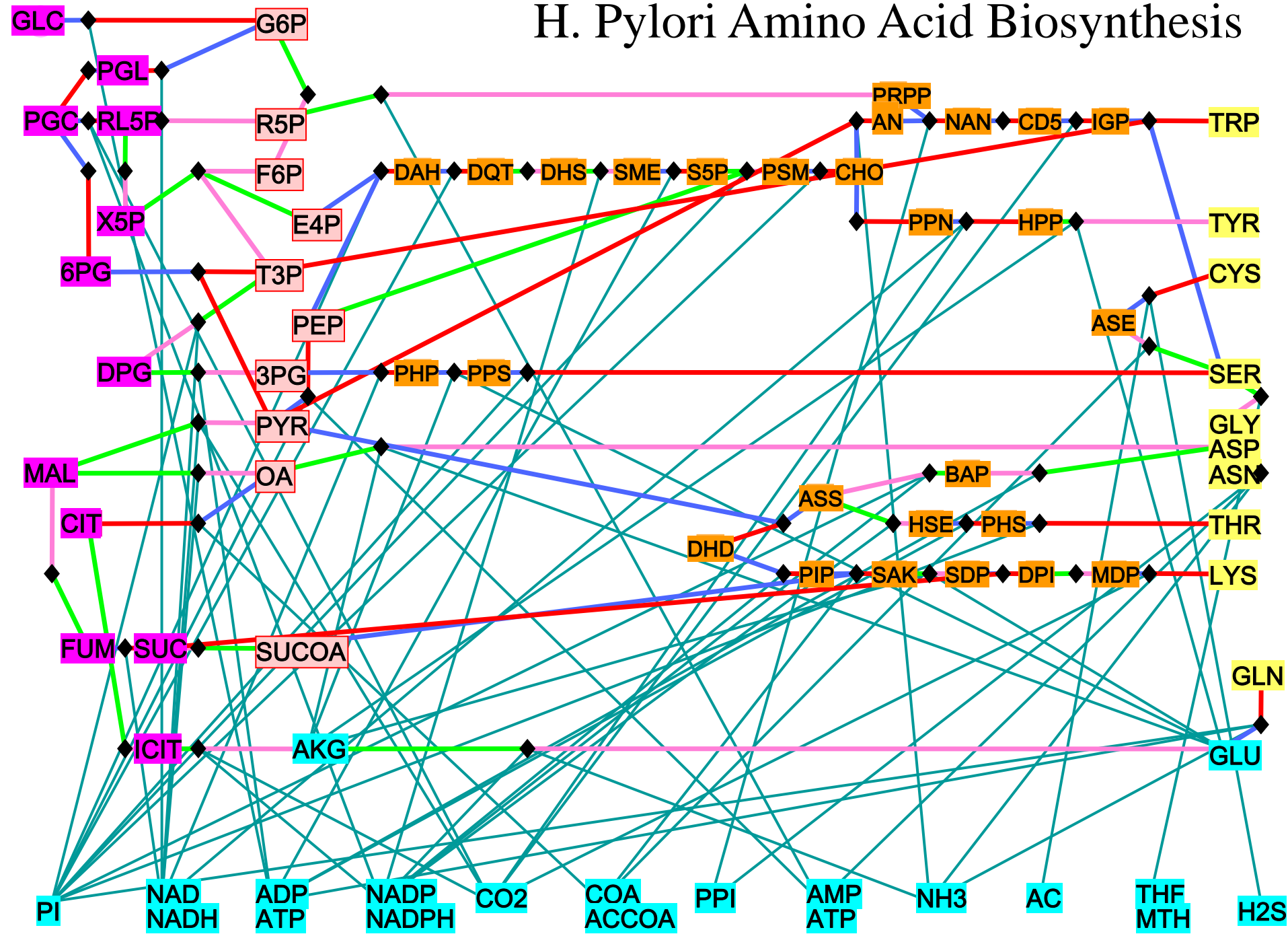
ATP

Name resolution?

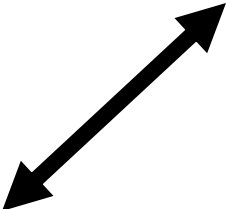
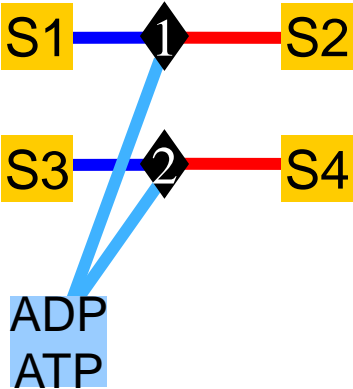
- Locating: Enzymes and
 - Substrates
 - Allosteric regulator
- Global search by diffusion
- Spatial localization by “solid state” complexes



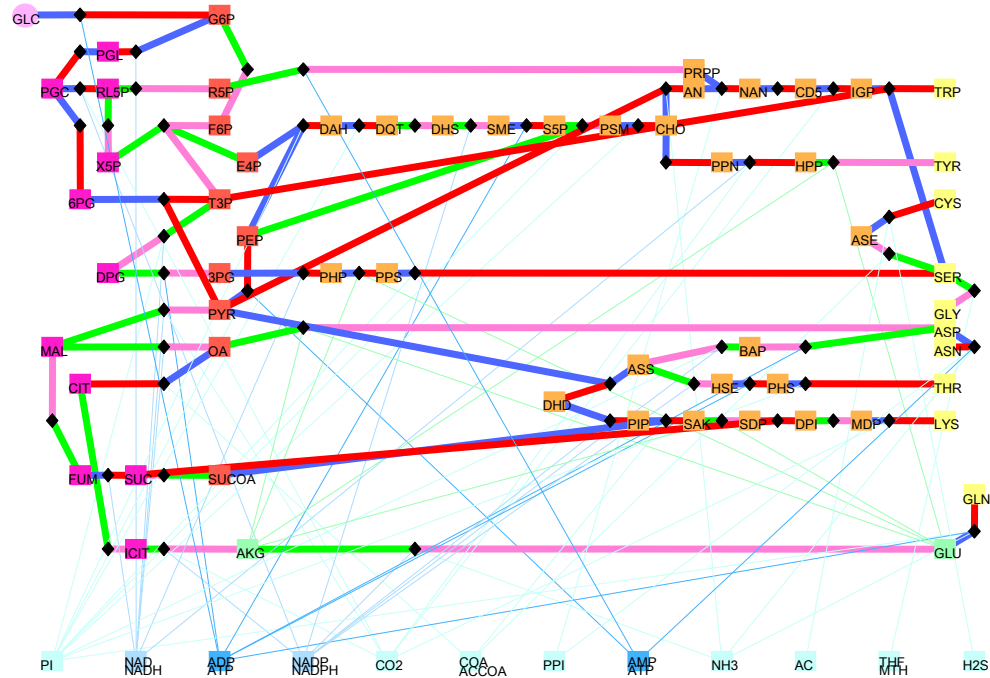
H. Pylori Amino Acid Biosynthesis



H Pylori
amino acid
biosynthesis



As a bipartite
labeled graph.



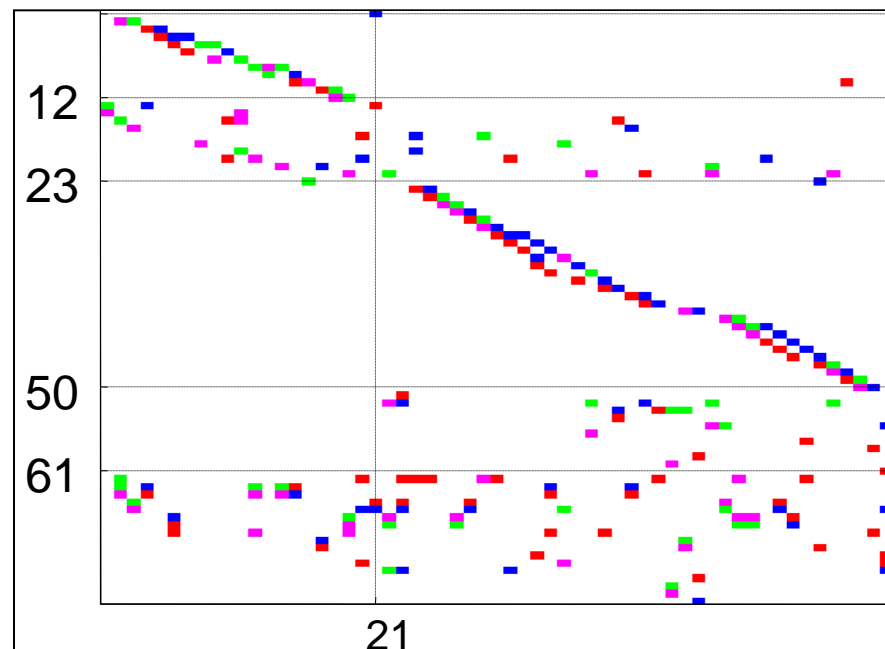
H Pylori amino acid biosynthesis

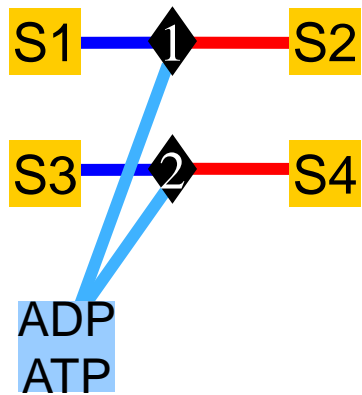
Substrates

Carriers

S_1	-1	0
S_2	1	0
S_3	0	-1
S_4	0	1
ATP	-1	-1
ADP	1	1

As a color coded
(for reversibility)
stoichiometry
matrix.



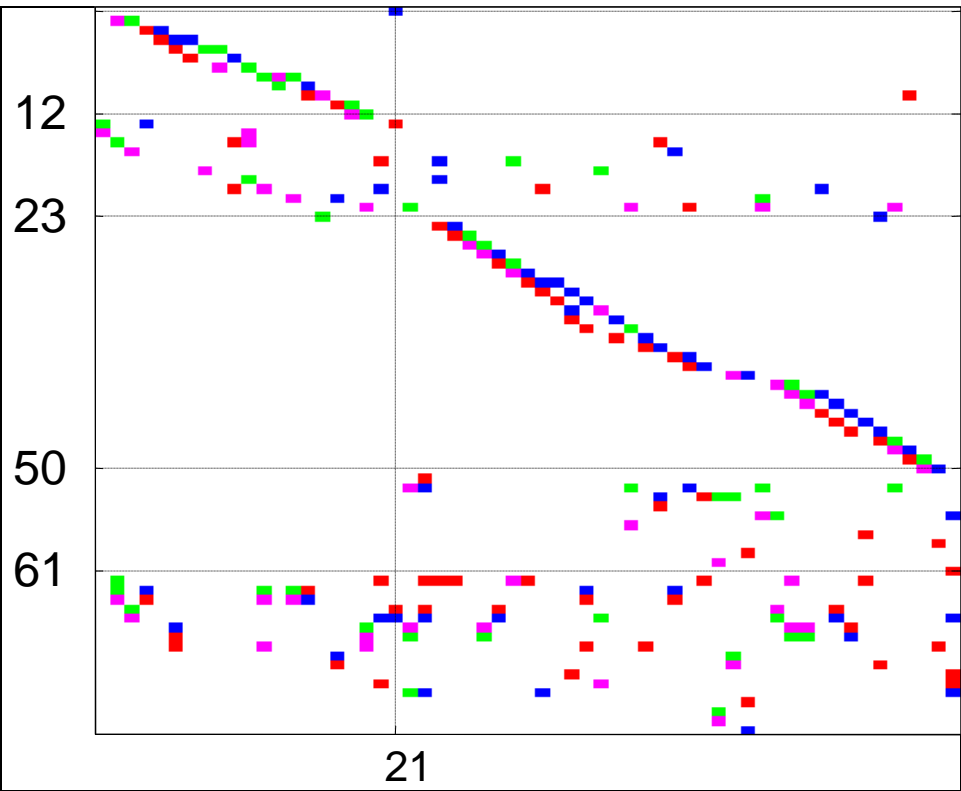
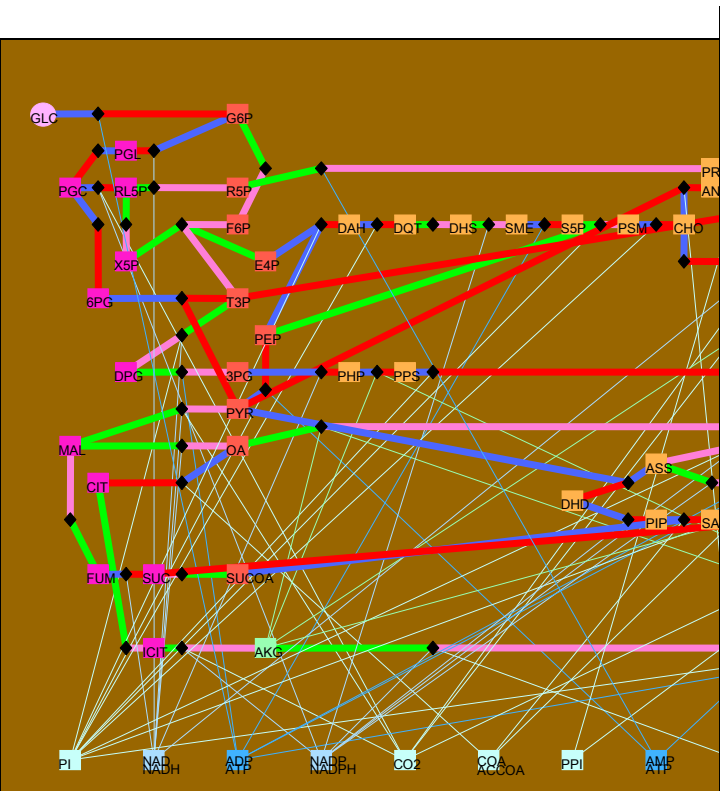


These are equivalent to each other but **not** to unipartite graphs.

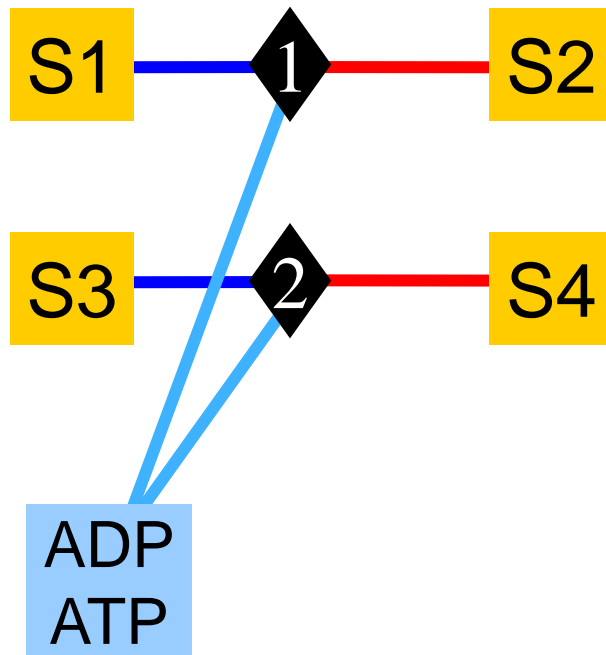
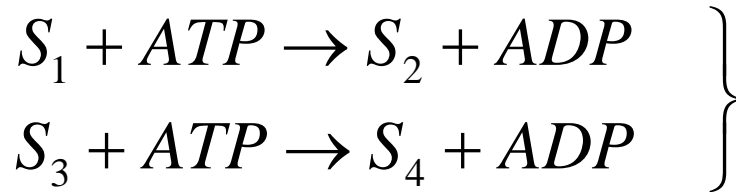
Substrates

Carriers

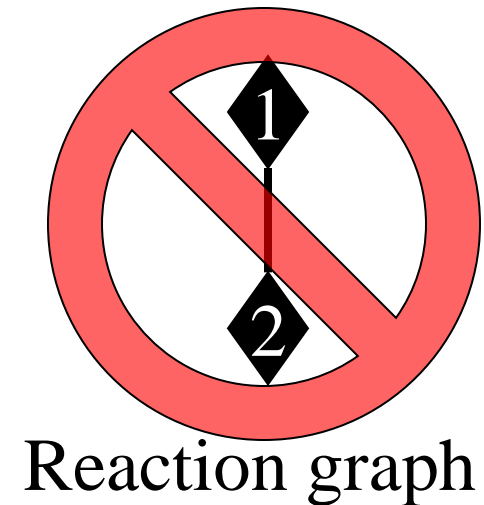
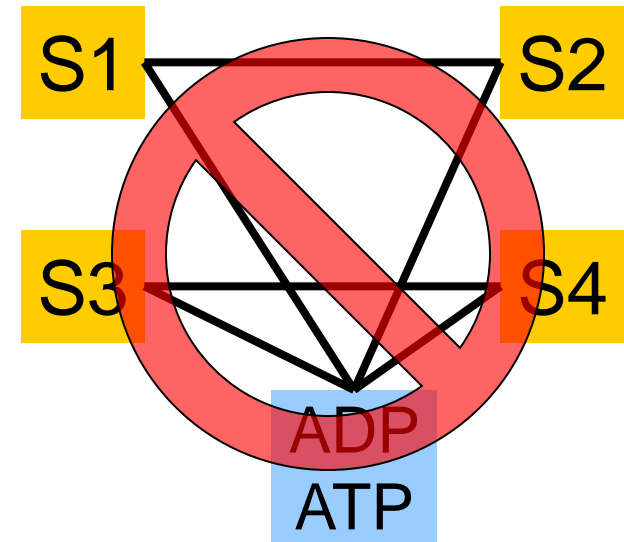
S_1	-1	0
S_2	1	0
S_3	0	-1
S_4	0	1
ATP	-1	-1
ADP	1	1



Unipartite projections
lose too much.

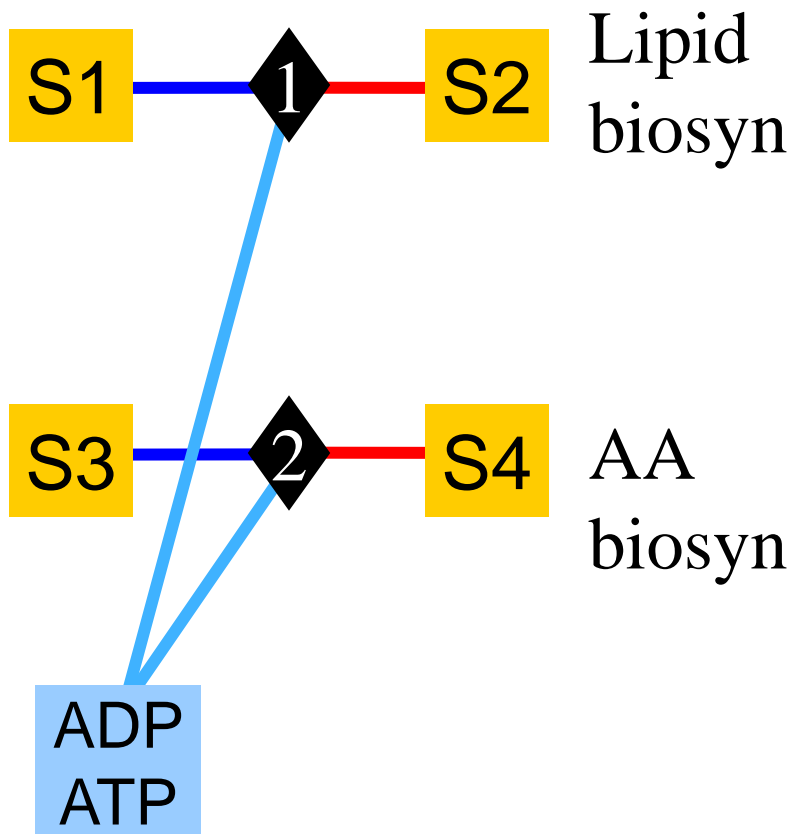


Substrate graph

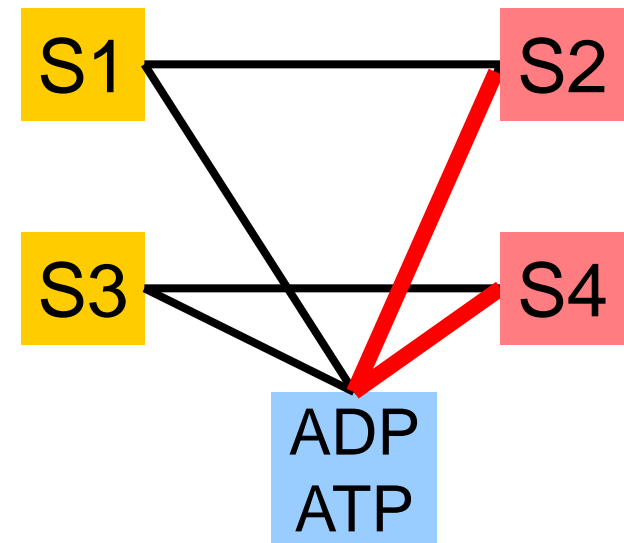


Reaction graph

Suppose these reactions
are in different modules,
say,



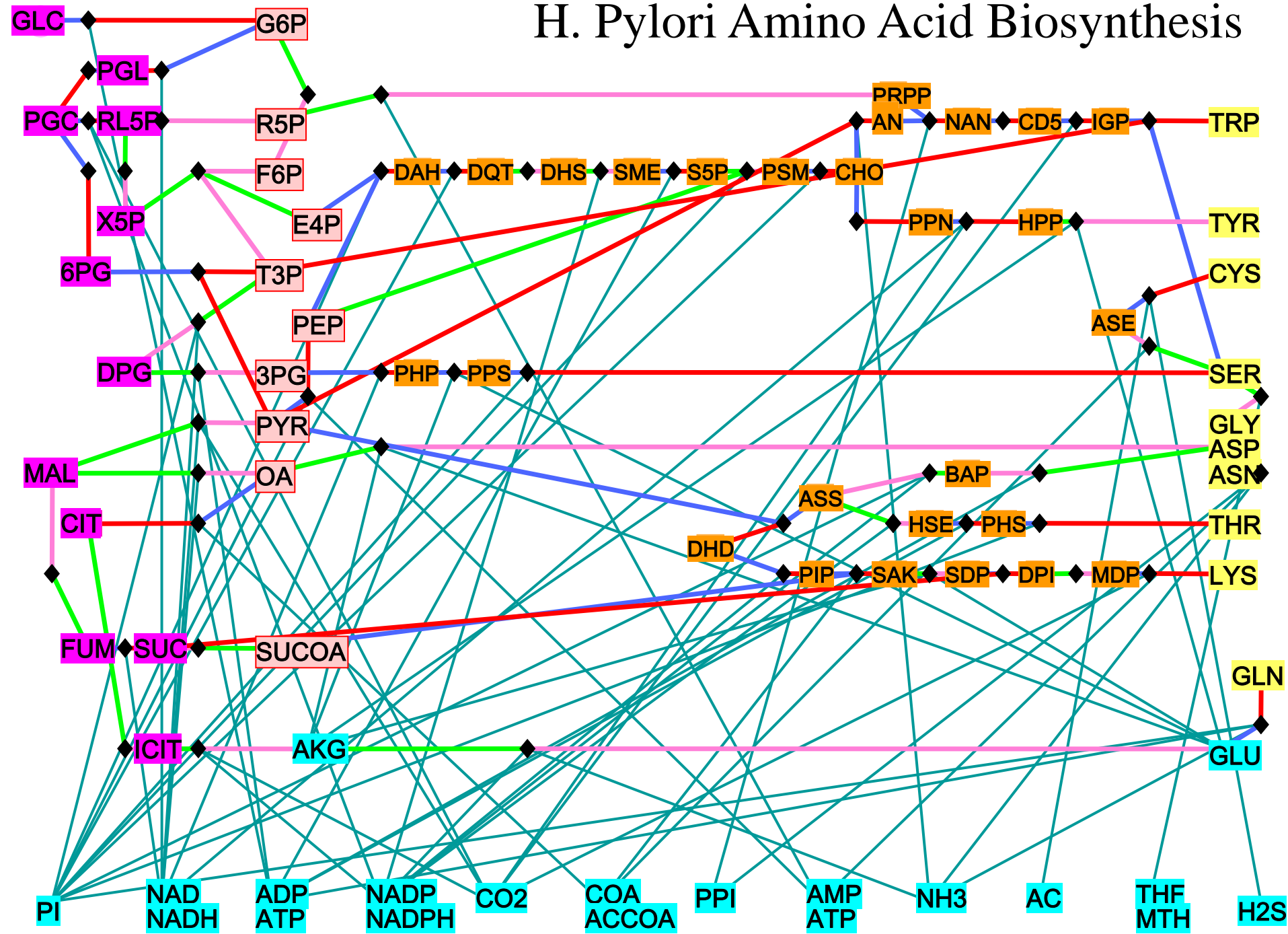
Substrate graph

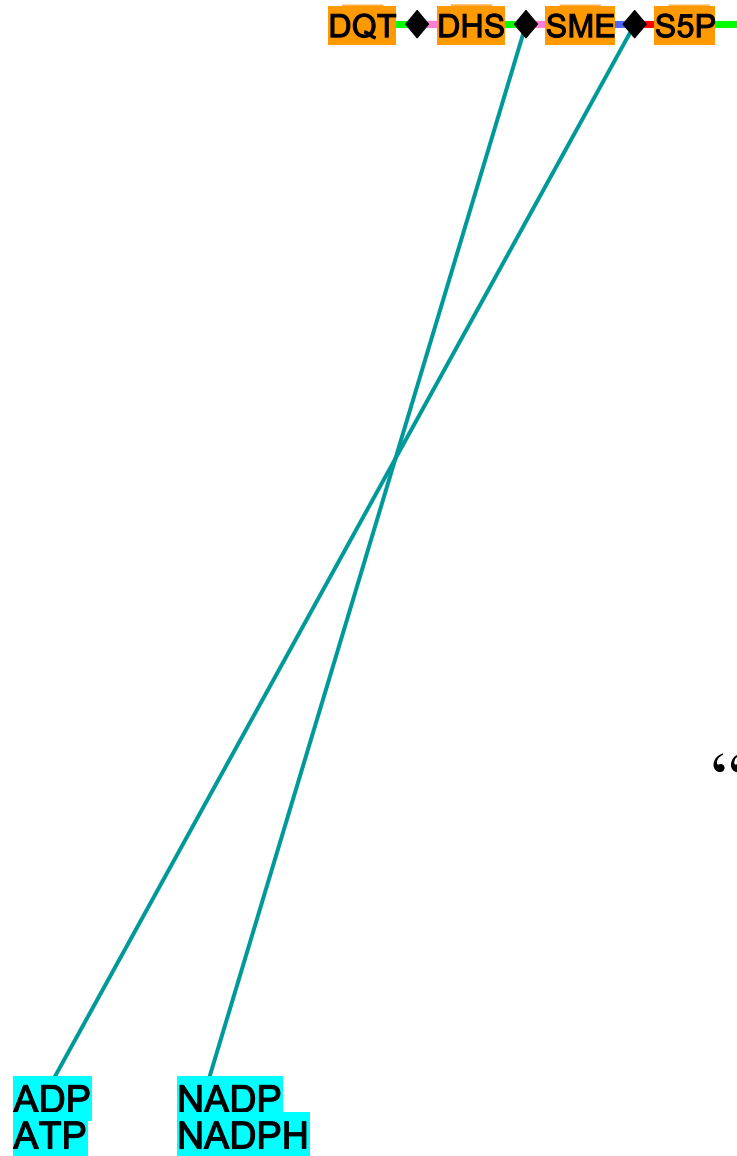


“Small world?”

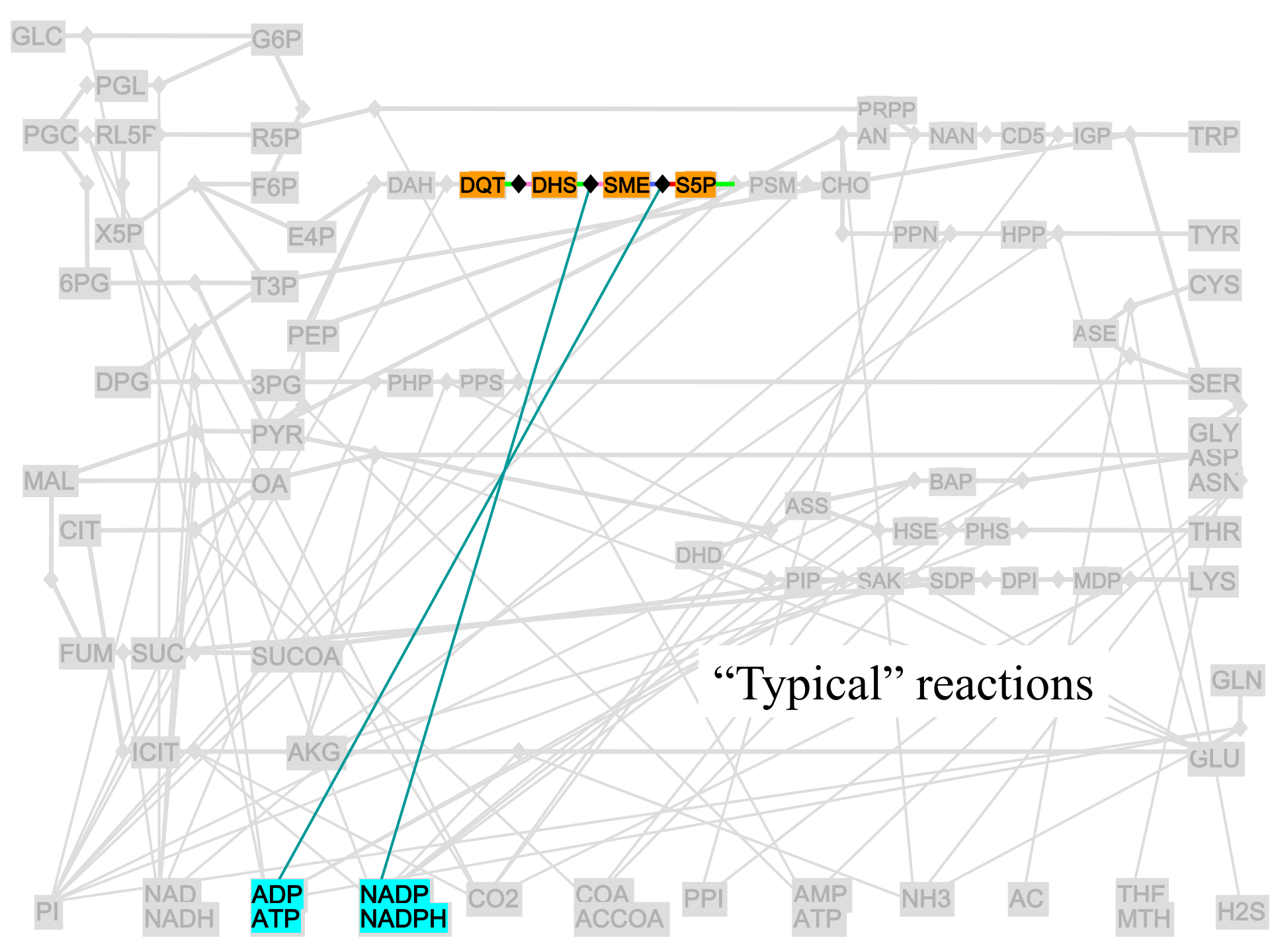
Not really.

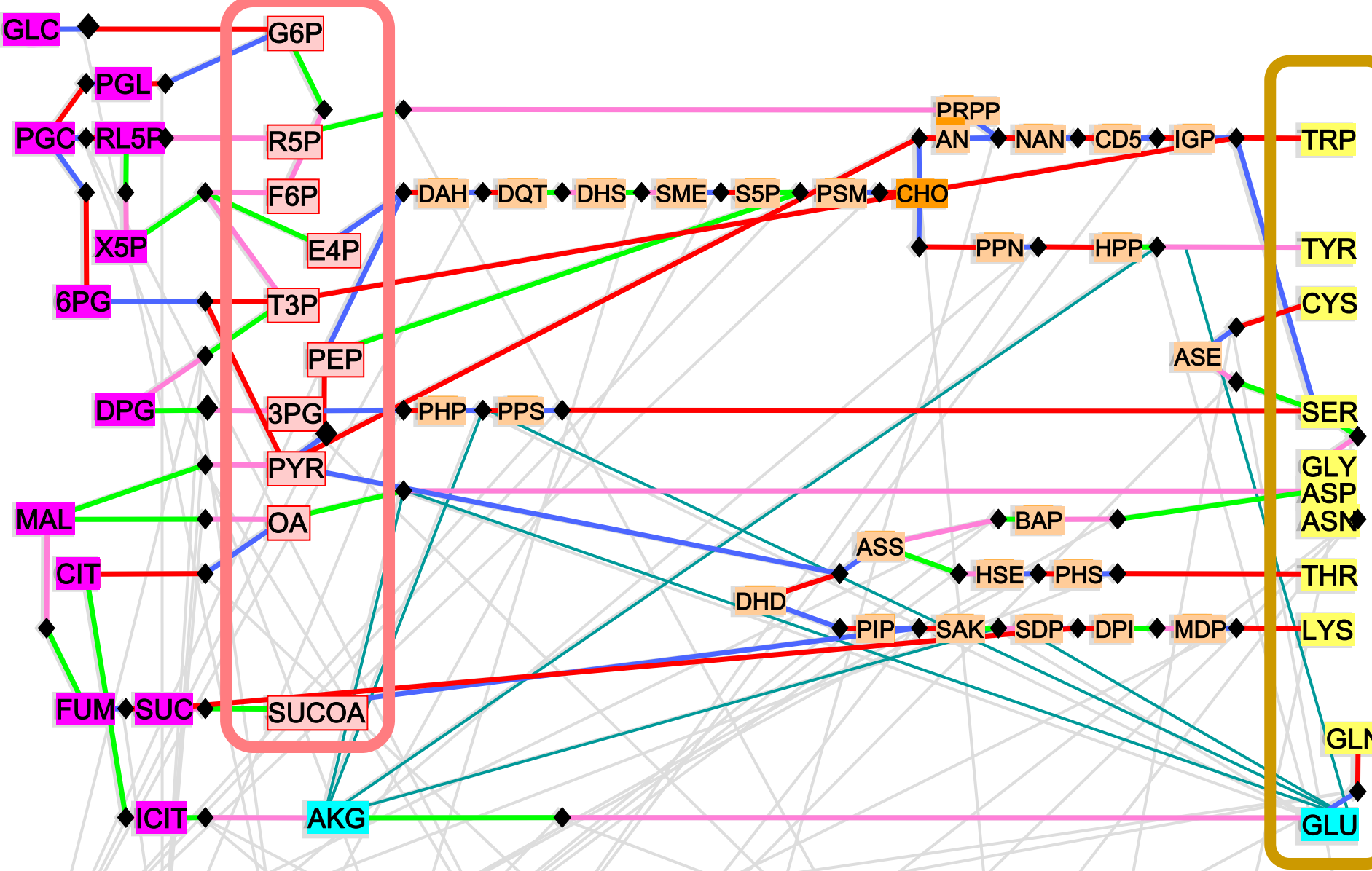
H. Pylori Amino Acid Biosynthesis





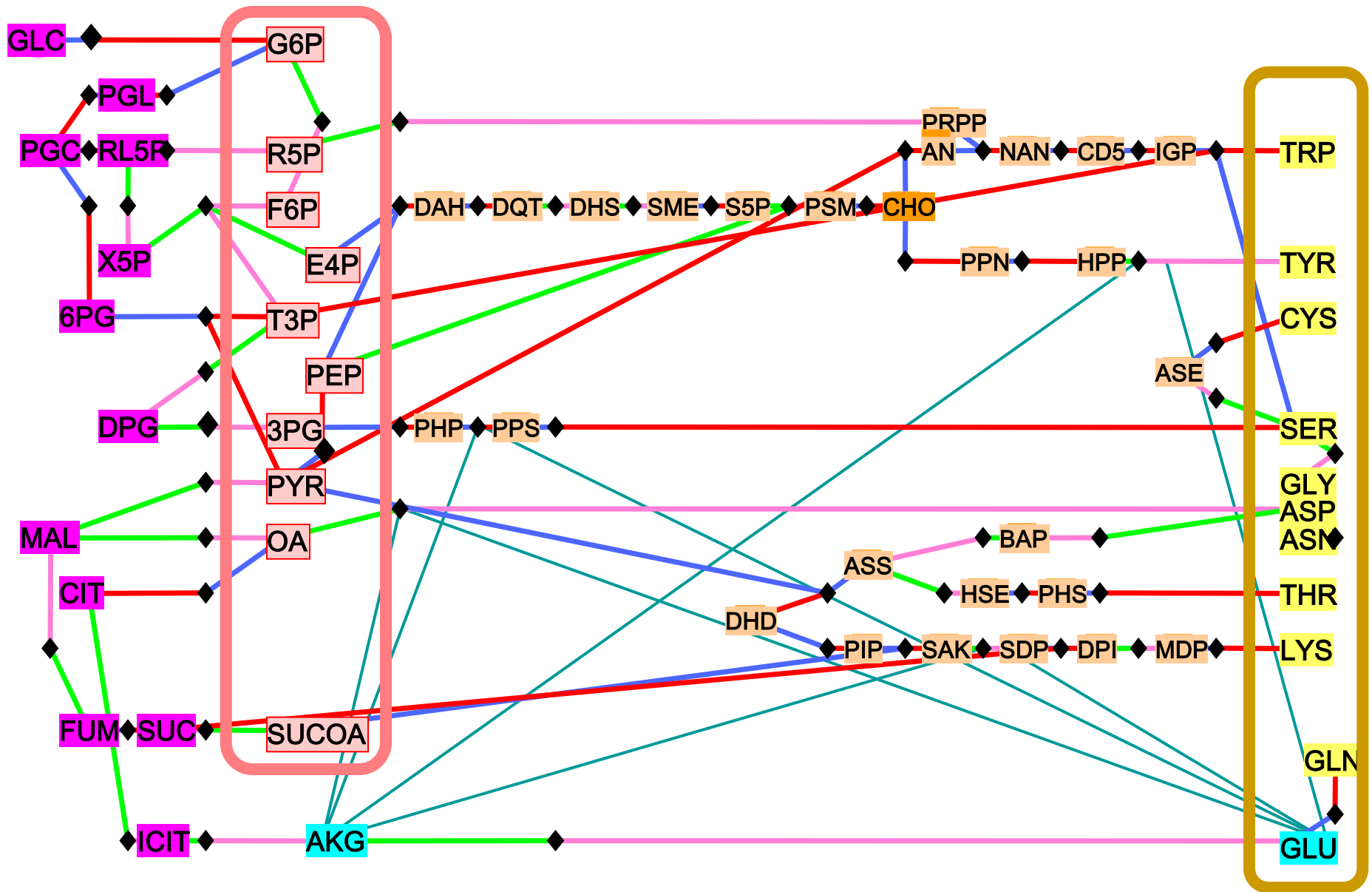
“Typical” reactions

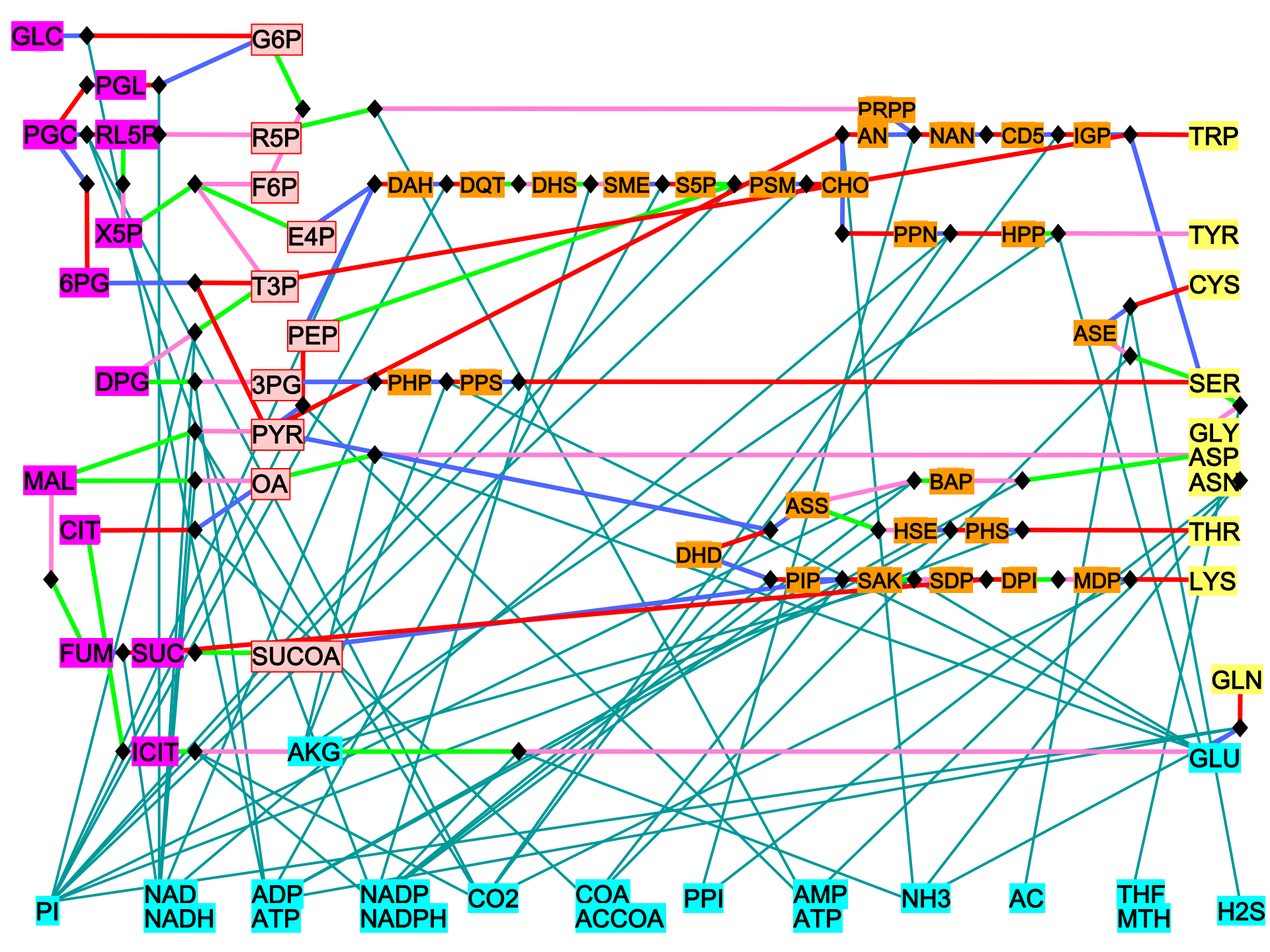




precursors

amino acids

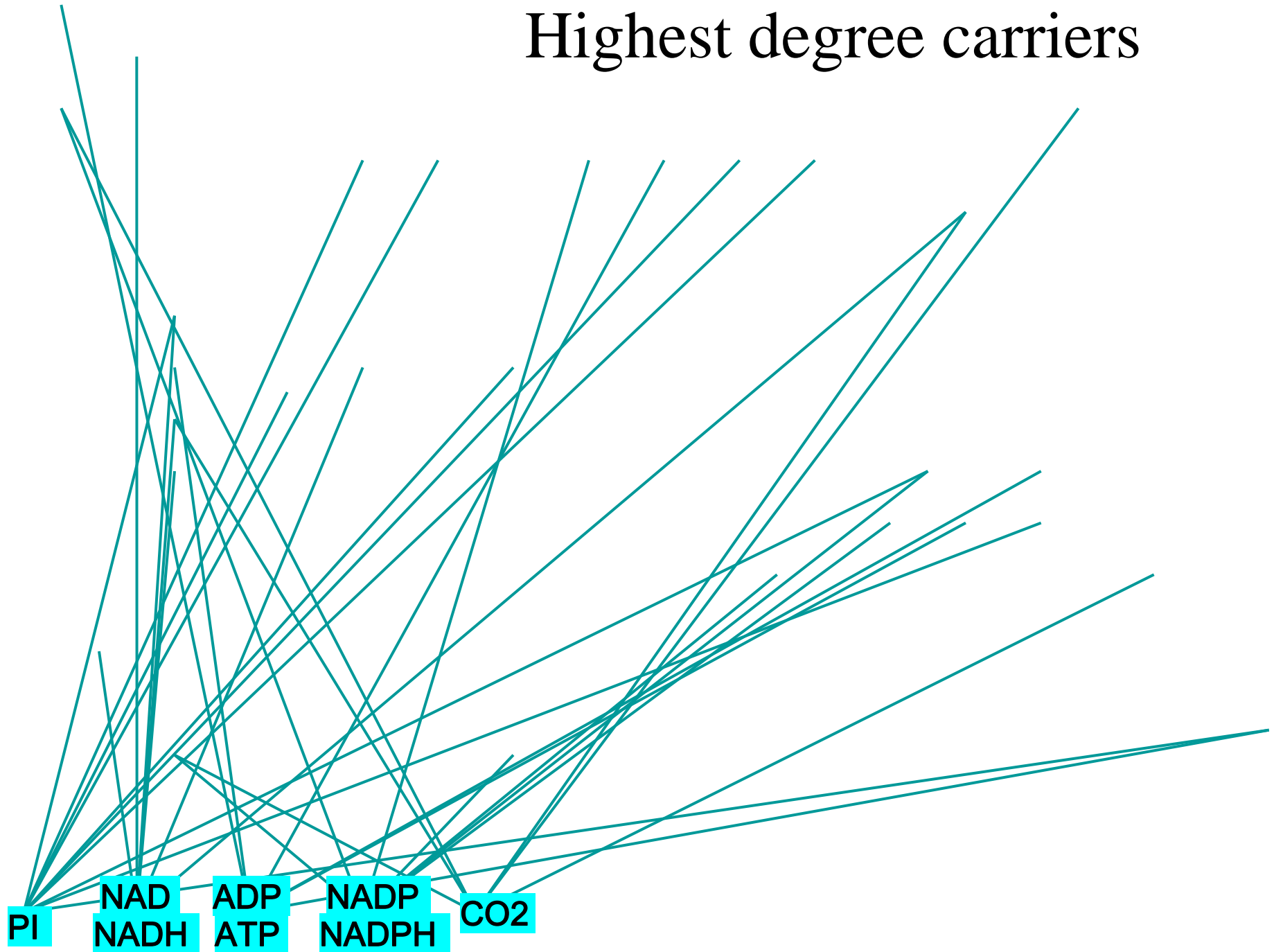




Aside

- A popular view of “modularity” is
 - High connectivity within the module
 - Low connectivity to the outside
- This is intuitively appealing, and there are some examples...
- ...but the most important elements of biological modularity are often exactly the opposite of this

Highest degree carriers



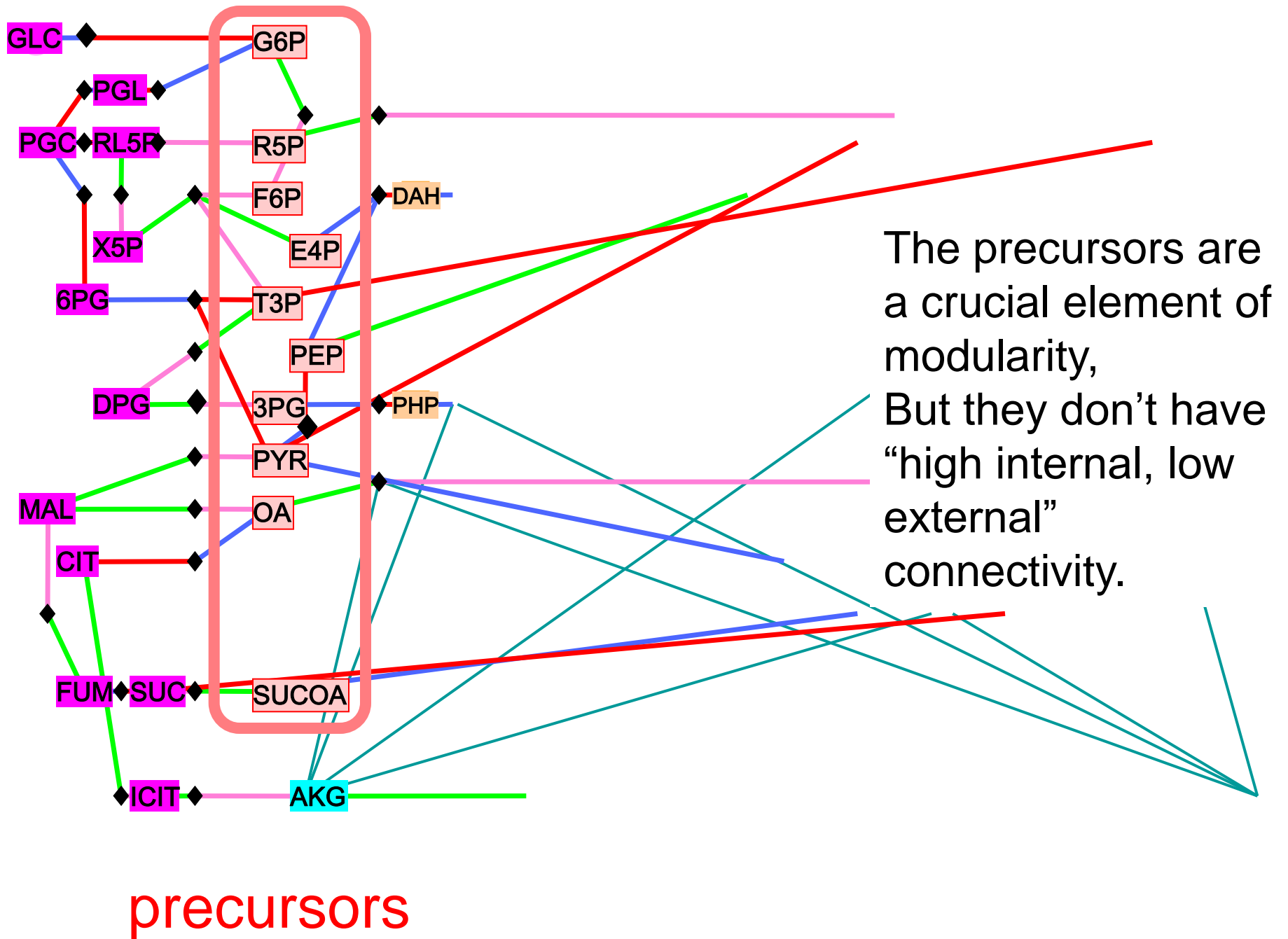
Highest degree carriers

The carriers are a crucial element of modularity, But they don't have “high internal, low external” connectivity.



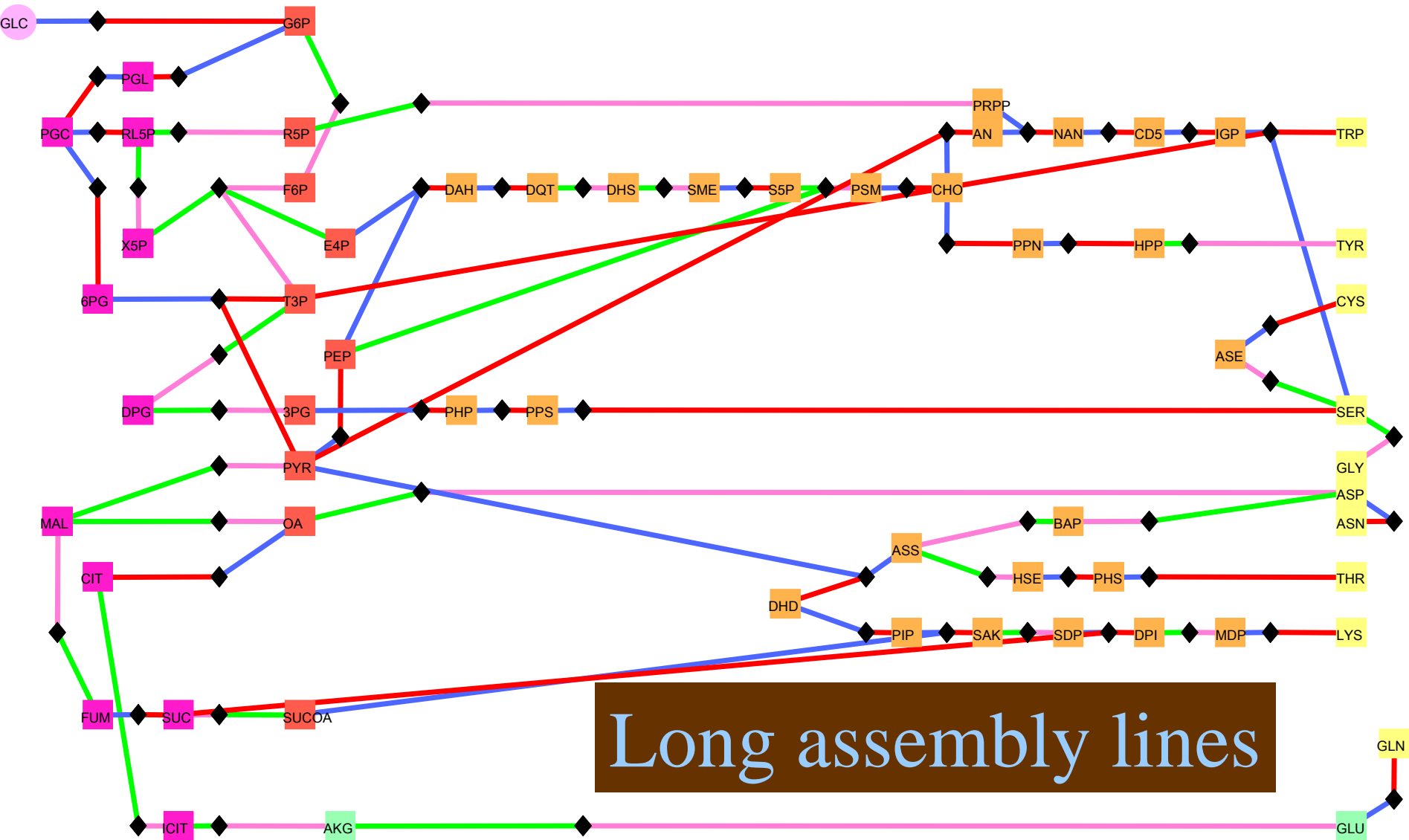
A network diagram illustrating the connectivity of various carriers. At the bottom, a red-bordered box contains five nodes: PI, NAD, NADH, ADP, ATP, NADP, NADPH, and CO2. These nodes are highly connected to a dense web of other nodes above them, represented by numerous teal lines. The text 'Highest degree carriers' is at the top, and a paragraph explains their role in modularity and connectivity.

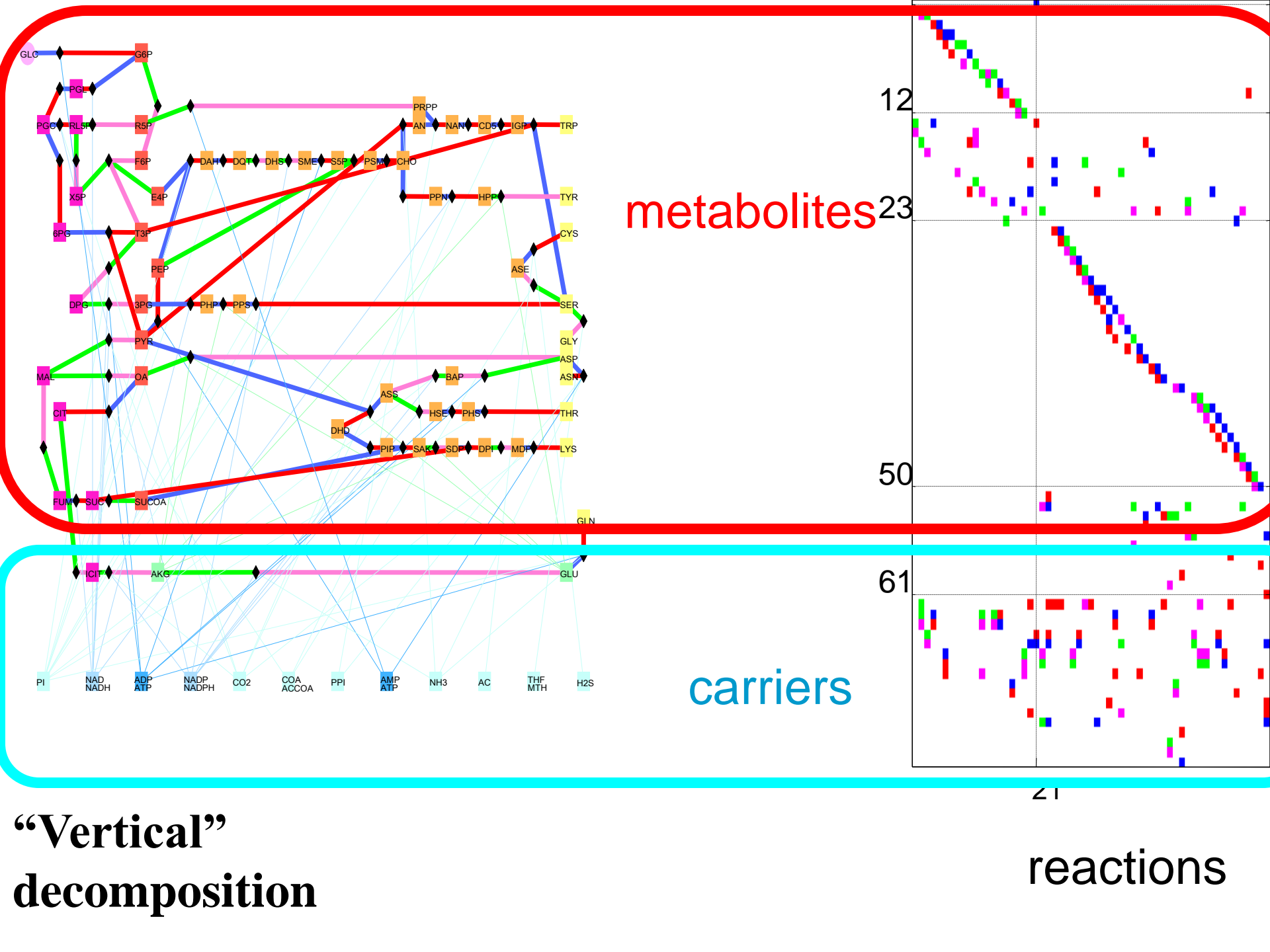
PI NAD NADH ADP ATP NADP NADPH CO2



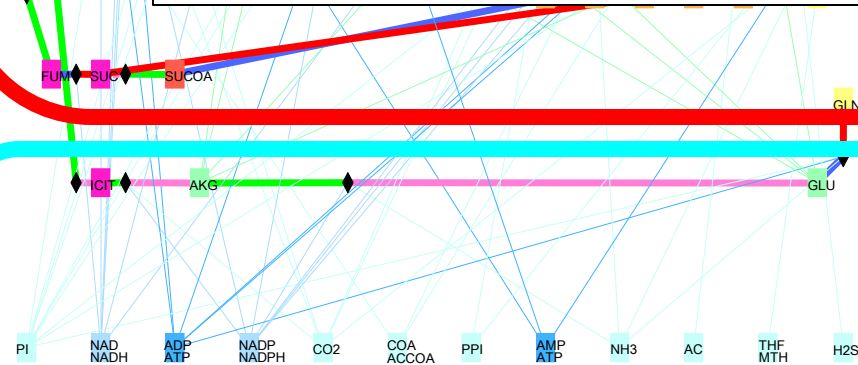
Without carriers

“long” not “small” worlds





- Each constrained quantity has a carrier
- Delivery by rapid diffusion
- “Price” by concentration of charged carrier?
- Elegant implementation of optimization and duality, integrated with delivery?



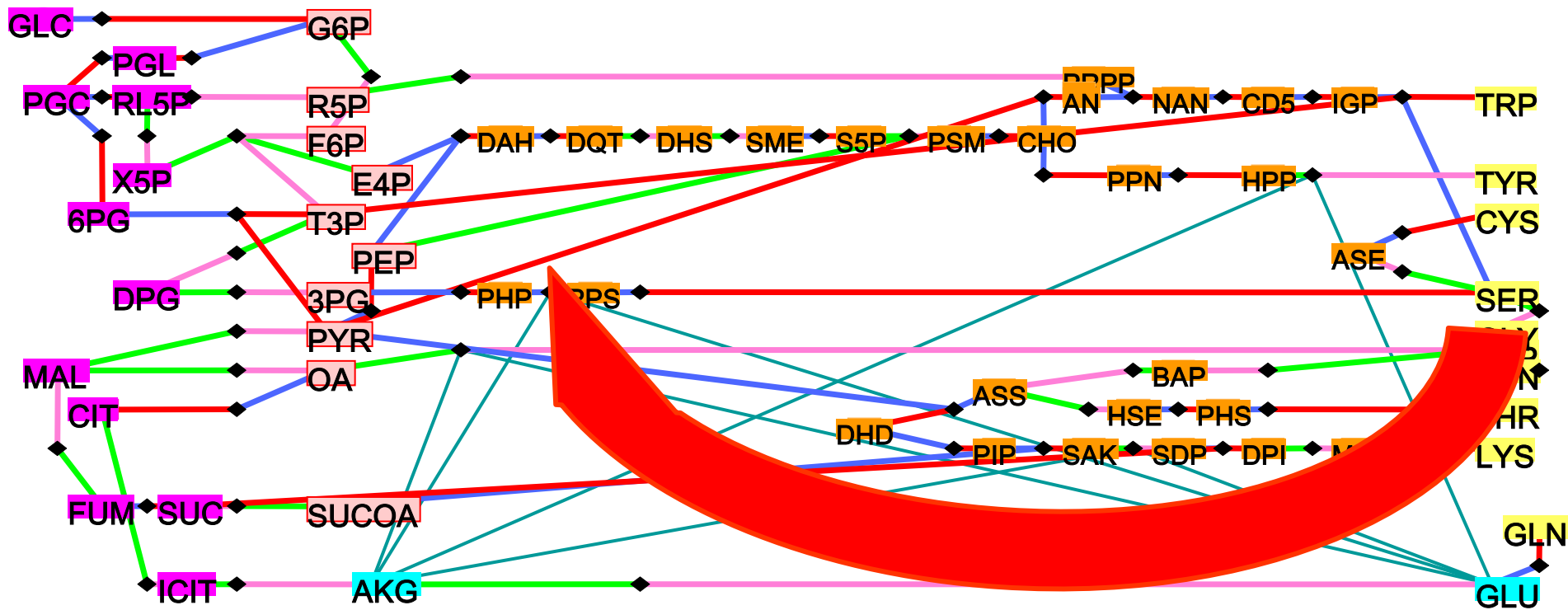
carriers

Prices?

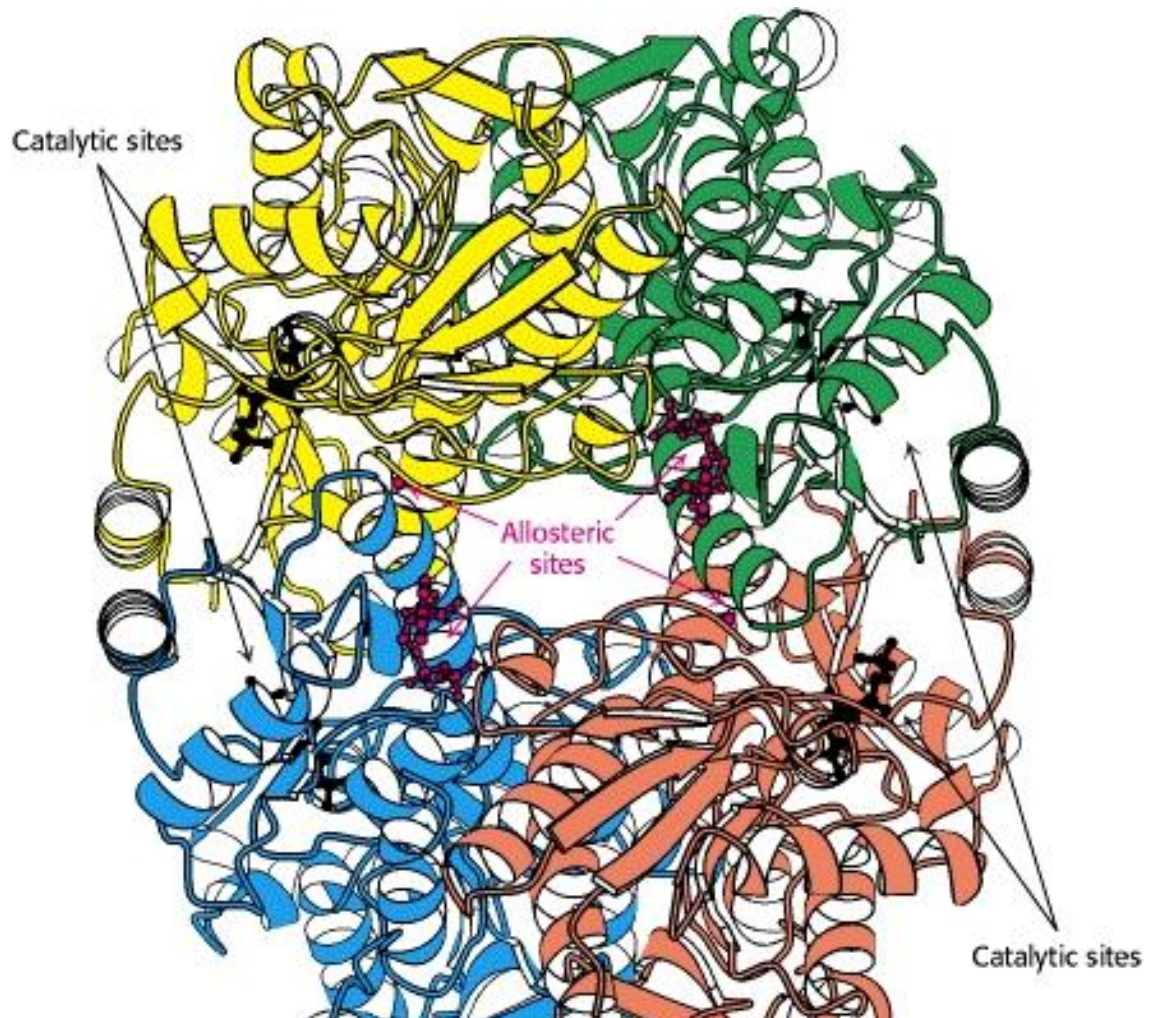
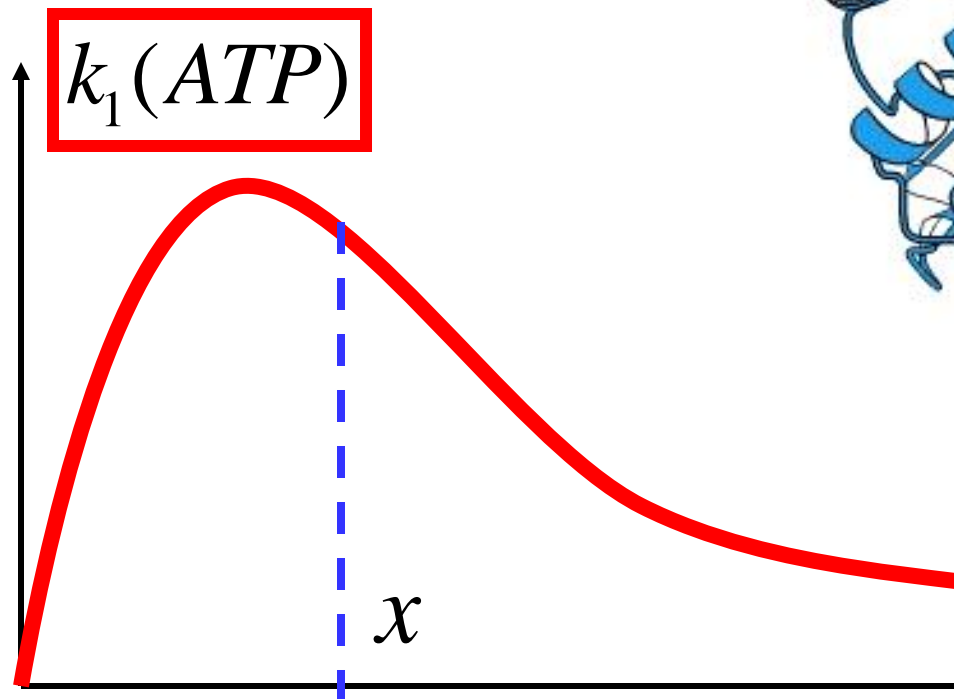
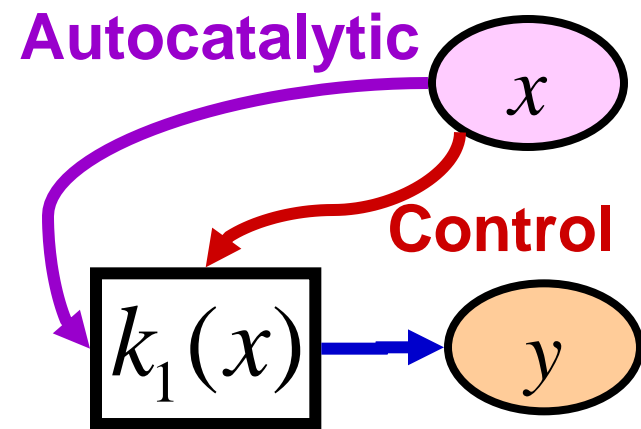
50

61

21



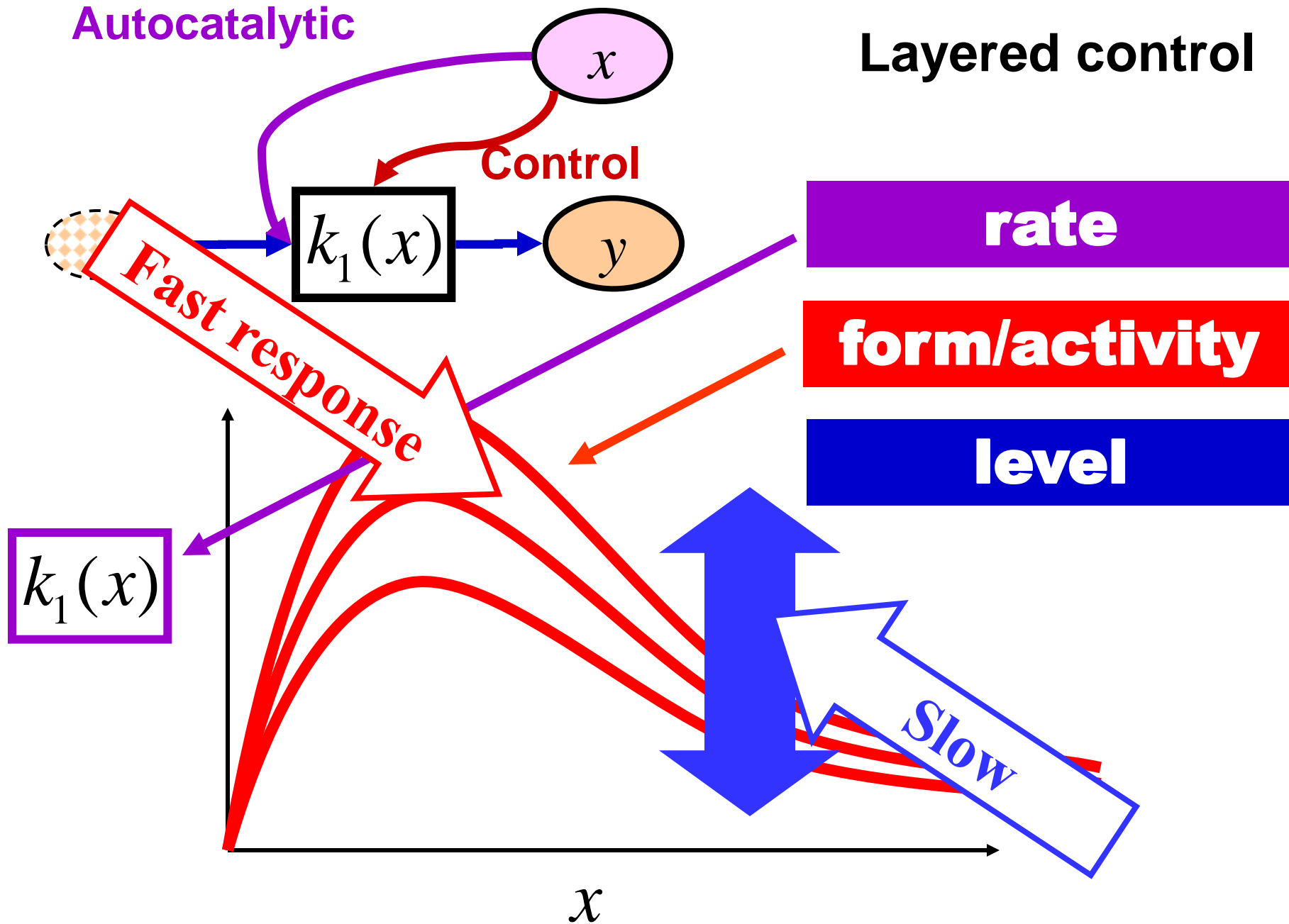
- Fastest allosteric feedback control
- Complex proteins
- High metabolic overhead
- Hard to reprogram



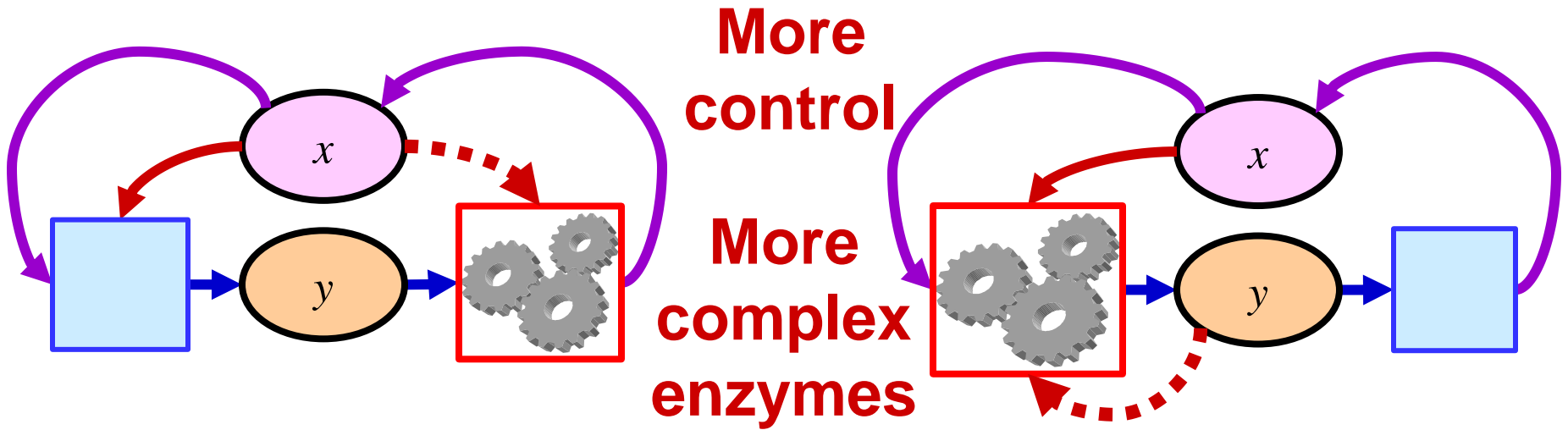
- Fastest allosteric feedback control
- **Complex proteins**
- High metabolic overhead
- **Hard to reprogram**

Autocatalytic

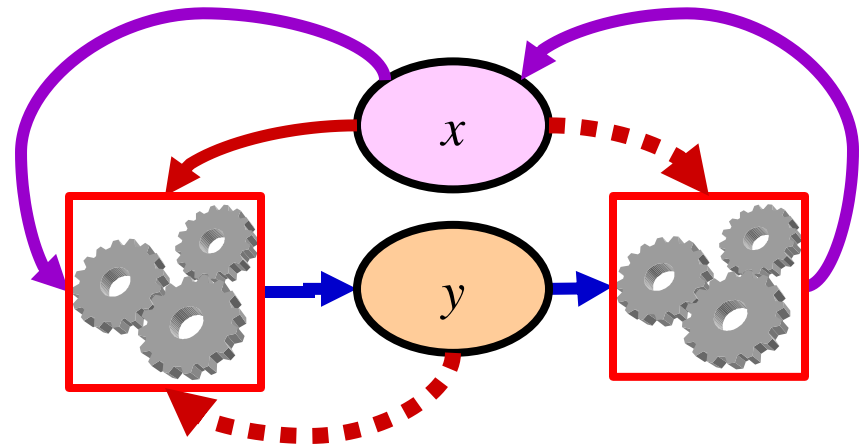
Layered control



- How to get rid of the RHP zero?
- What are the new tradeoffs?

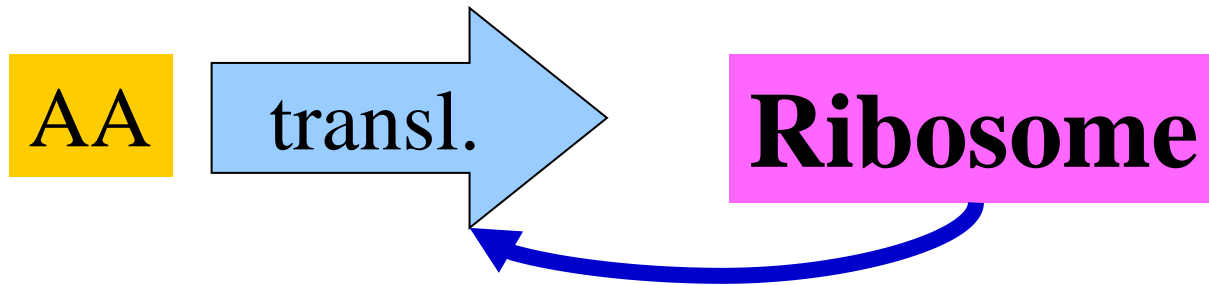


Biology appears
to do both



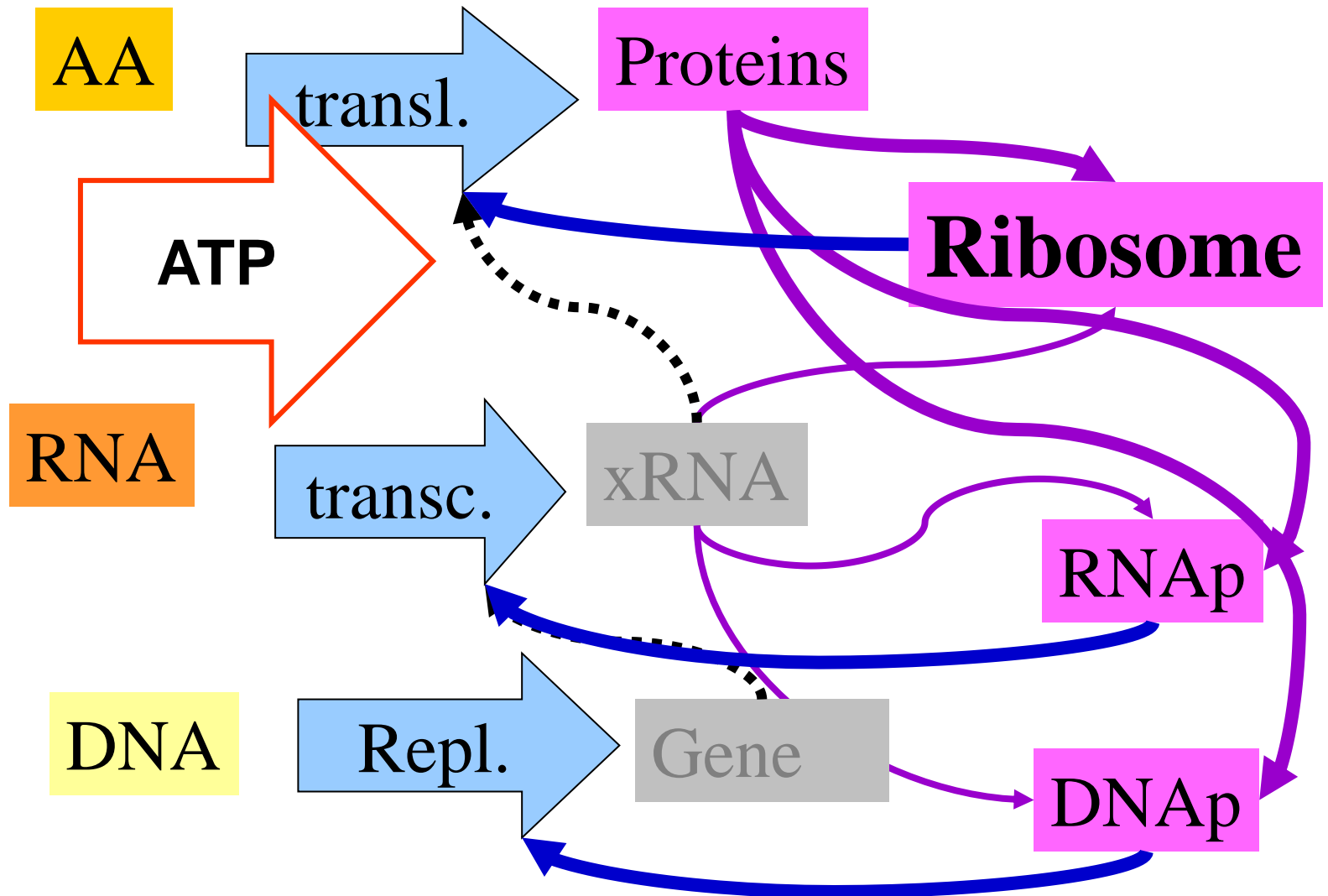
Lower layer autocatalysis

Ribosomes making ribosomes



Lower layer autocatalysis

Macromolecules making ...



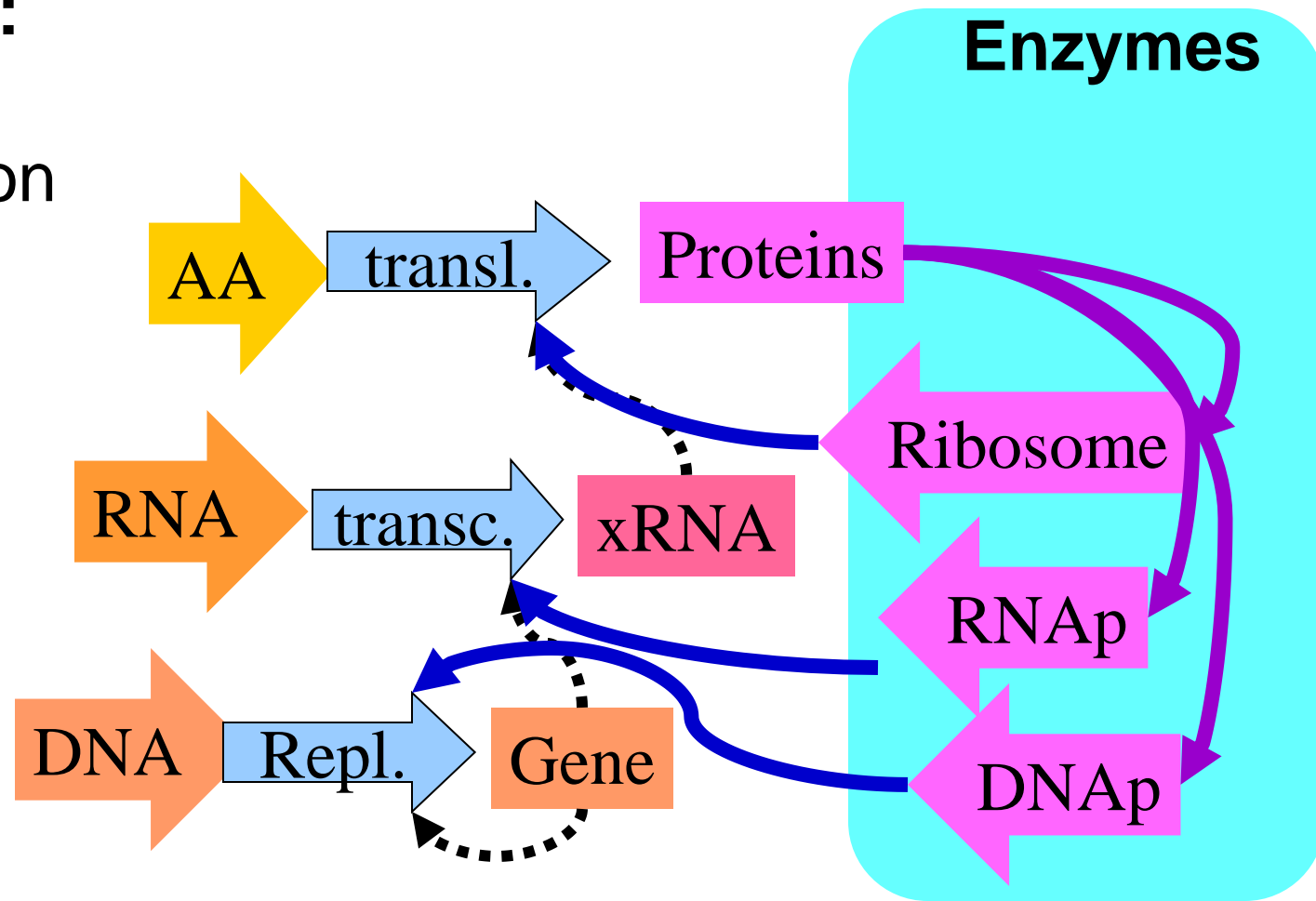
Autocatalytic within lower layers

- Collectively self-replicating
- Ribosomes make ribosomes, etc

Three lower layers? Yes:

- Translation
- Transcription
- Replication

Naturally recursive



Reactions

Flow/error

Protein level

Translation

Flow/error

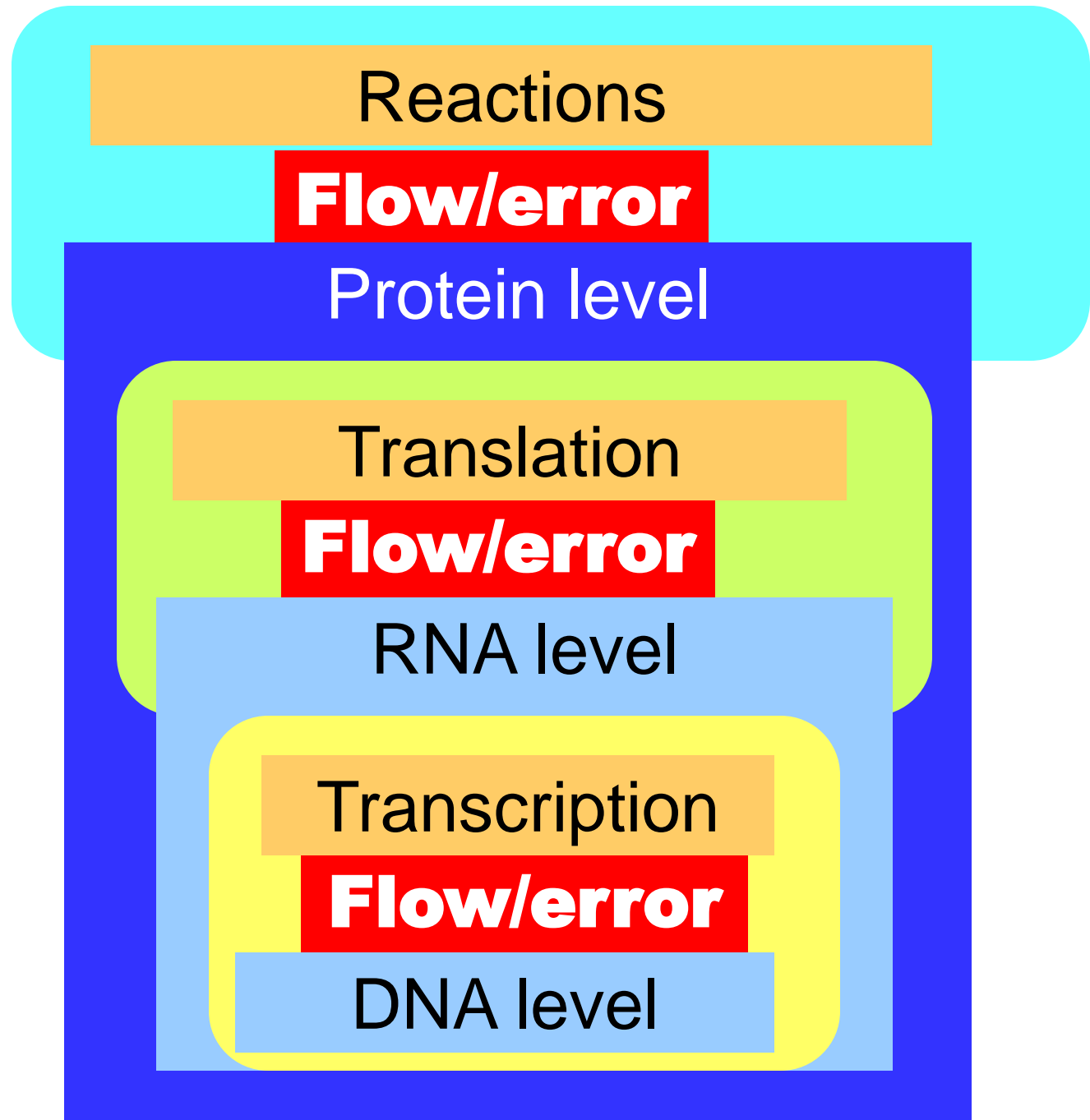
RNA level

Transcription

Flow/error

DNA level

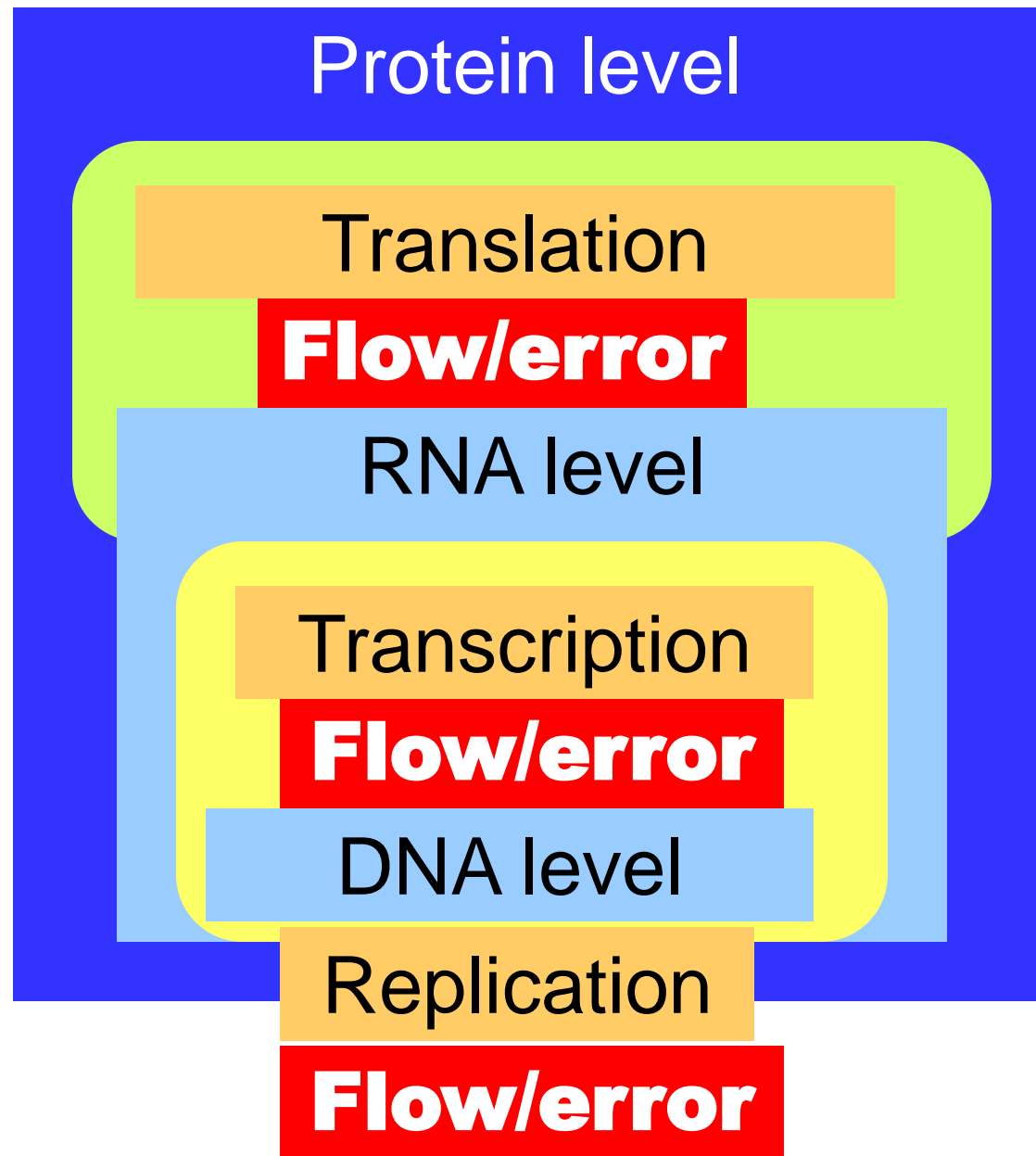
**Naturally
recursive**

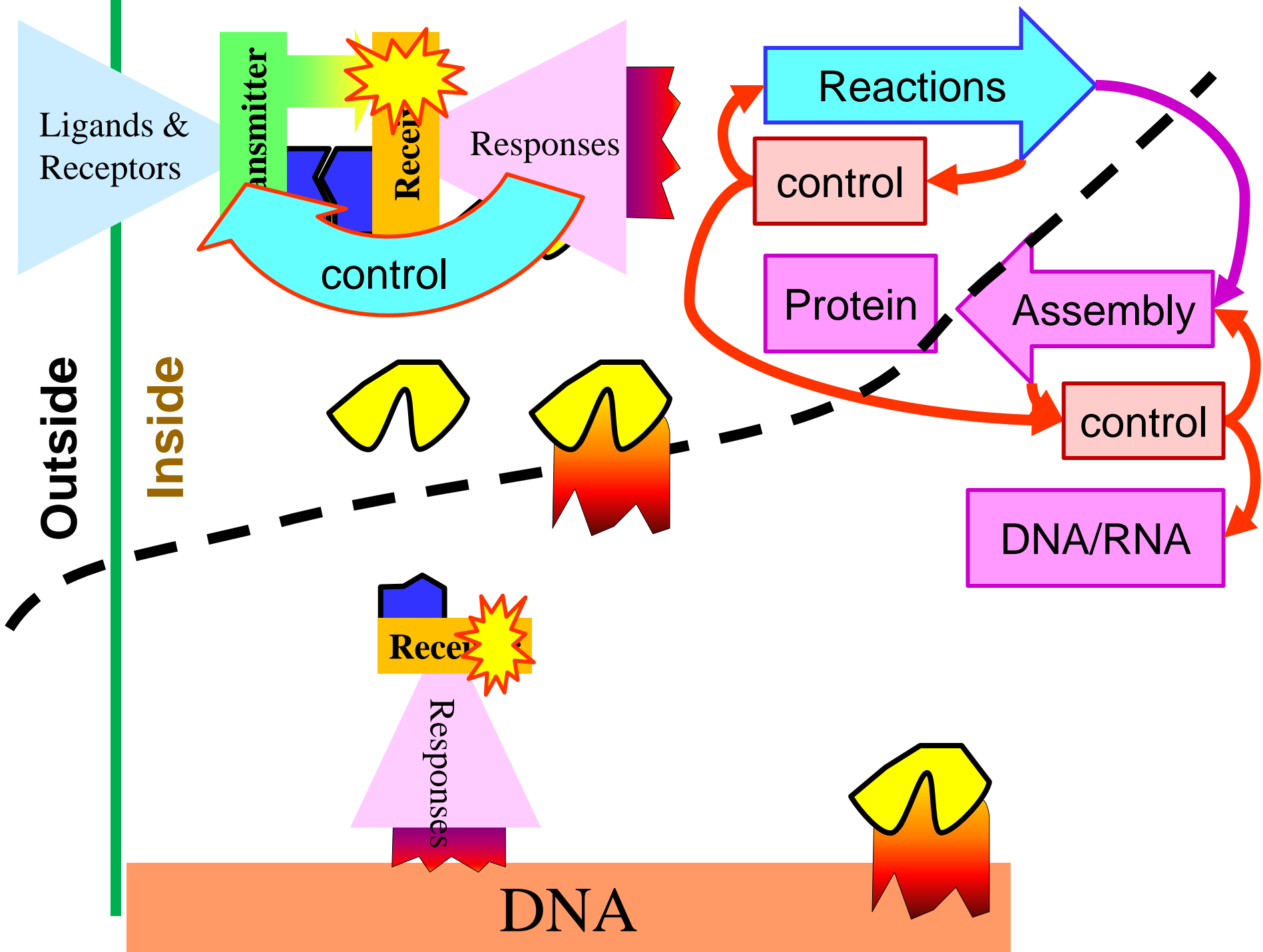


Three lower layers? Yes:

- Translation
- Transcription
- Replication/rearrangement

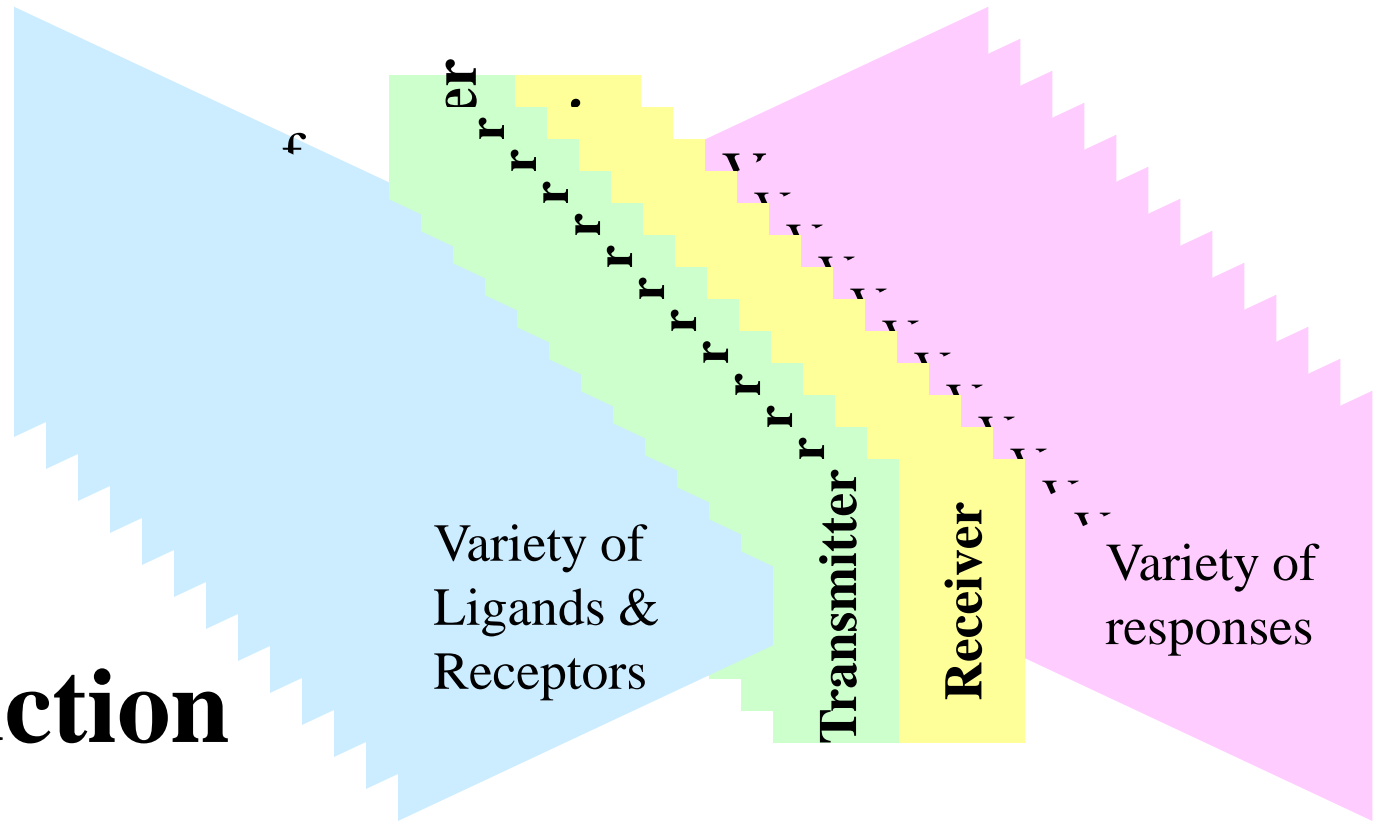
DNA Replication/
Rearrangement is
complex and
highly controlled

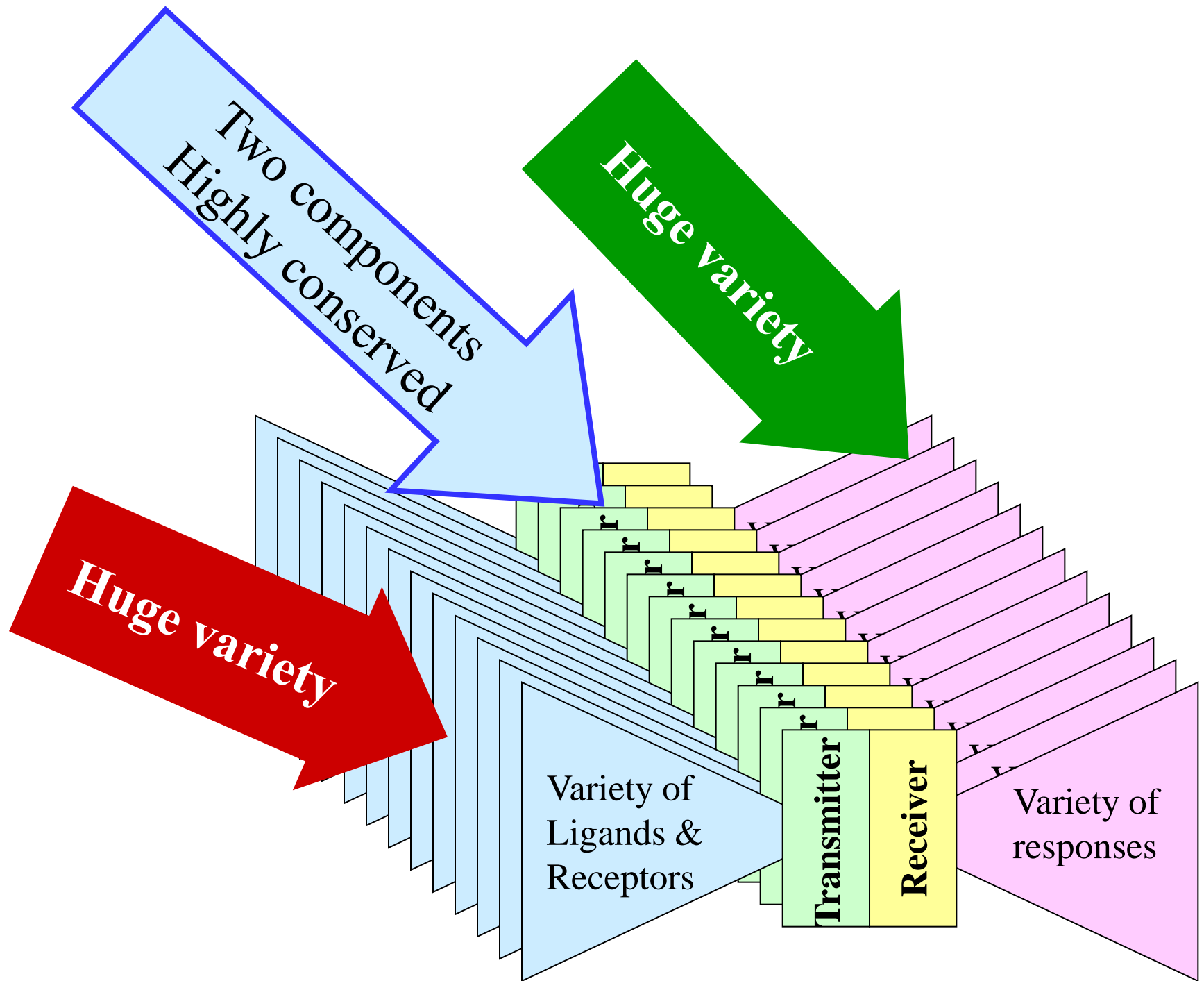




- ≈ 50 such “two component” systems in *E. Coli*
- All use the same protocol
 - Histidine autokinase transmitter
 - Aspartyl phospho-acceptor receiver
- Huge variety of receptors and responses
- Also multistage (phosphorelay) versions

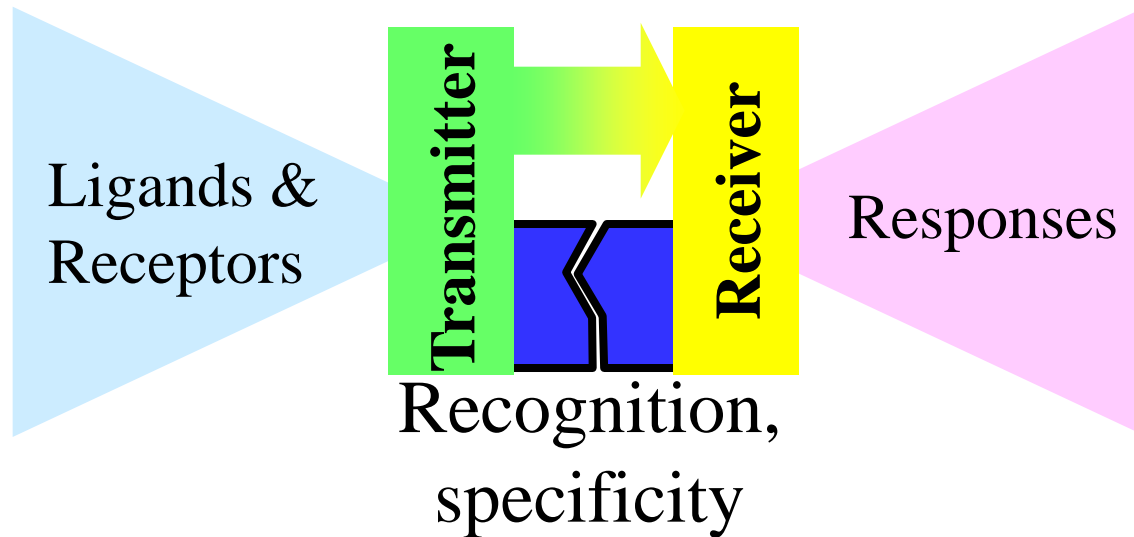
Signal transduction





Flow of “signal”

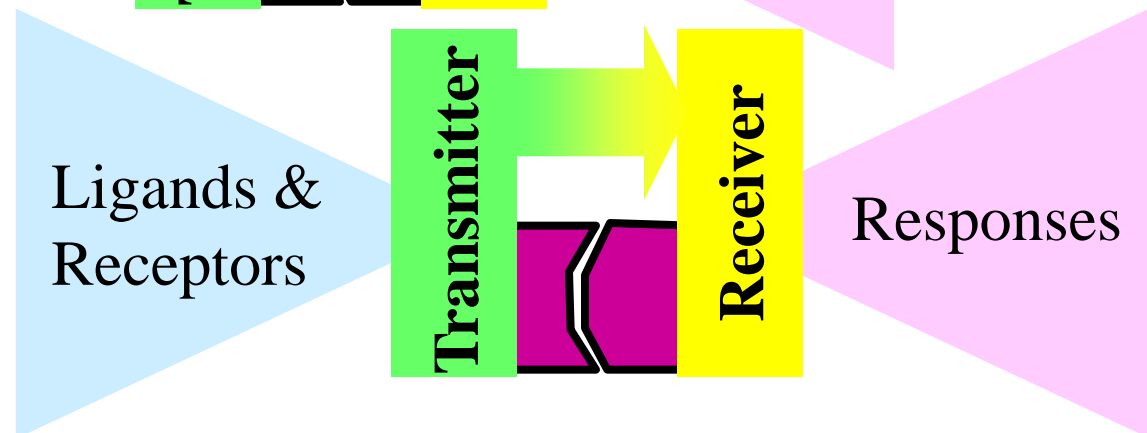
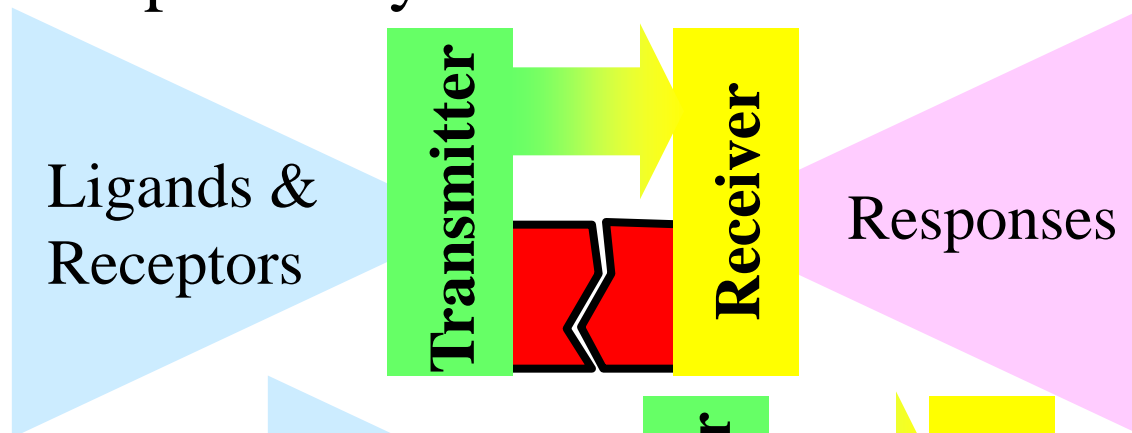
Shared
protocols



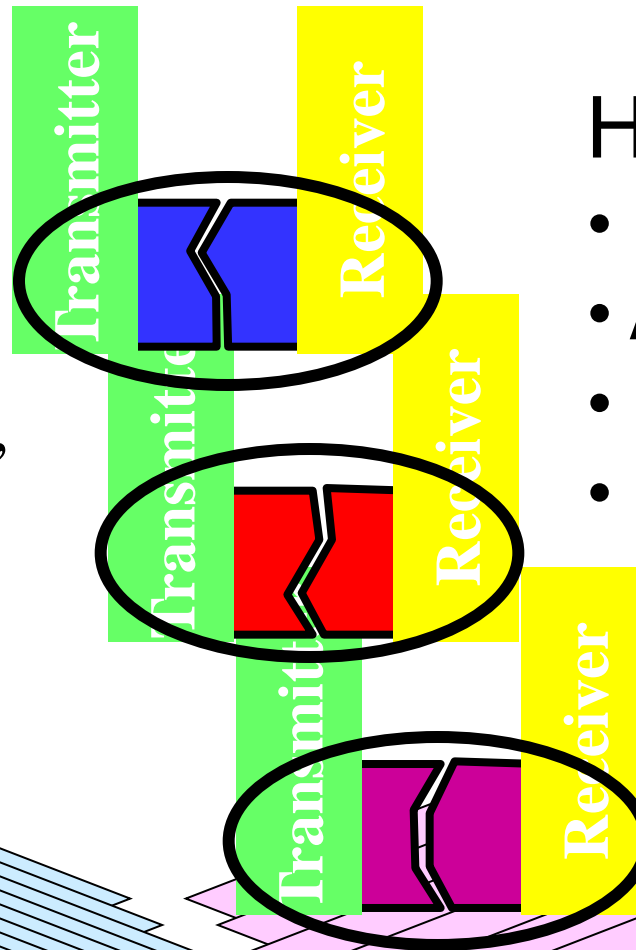
- “Name resolution” within signal transduction
- Transmitter must locate “cognate” receiver and avoid non-cognate receivers
- Global search by rapid, local diffusion
- Limited to very small volumes

Flow of “signal”

Shared
protocols



Recognition,
specificity



Huge variety

- Combinatorial
- Almost digital
- Easily reprogrammed
- Located by diffusion

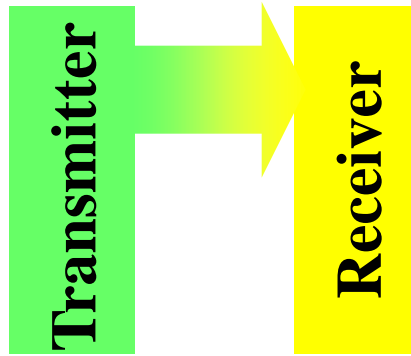
**Huge
variety**

Variety of
Ligands &
Receptors

**Huge
variety**

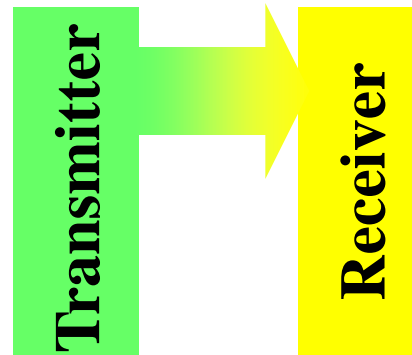
Variety of
responses

Flow of “signal”

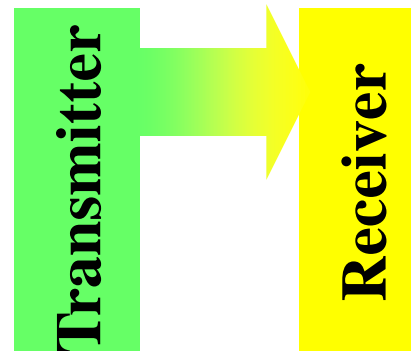


Limited variety

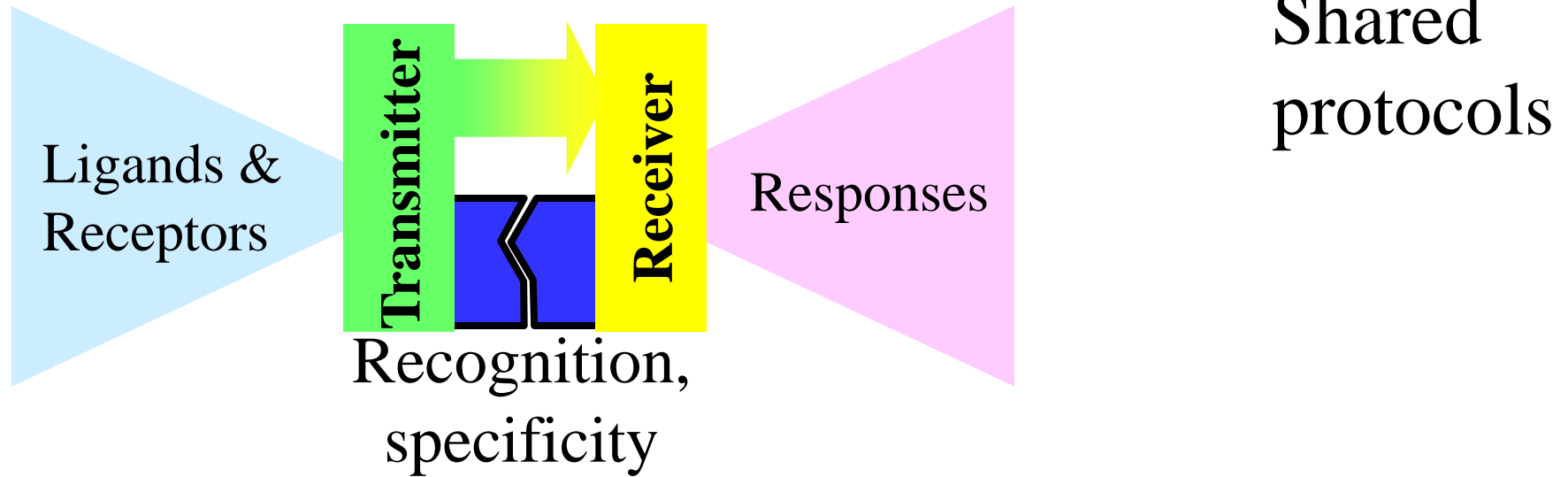
- Fast, analog (via #)
- Hard to change



Reusable in
different pathways



Flow of “signal”



Note: Any wireless system and the Internet to which it is connected work the same way.

Flow of packets





“Name” recognition
= molecular recognition
= localized functionally
= global spatially

Transcription factors
do “name” to “address”
translation



“Name” recognition
= molecular recognition
= localized functionally

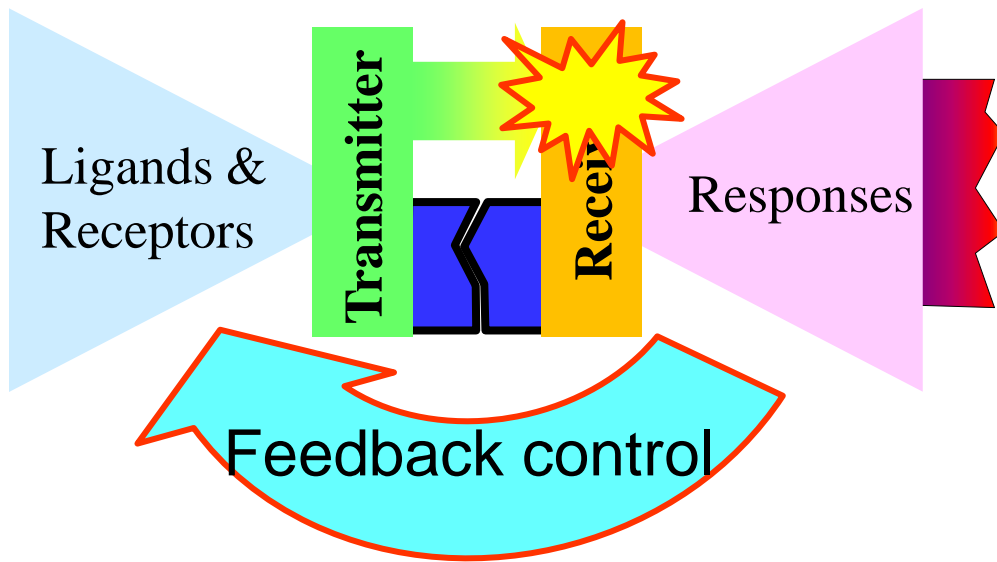
Transcription factors
do “name” to “address”
translation

Both are

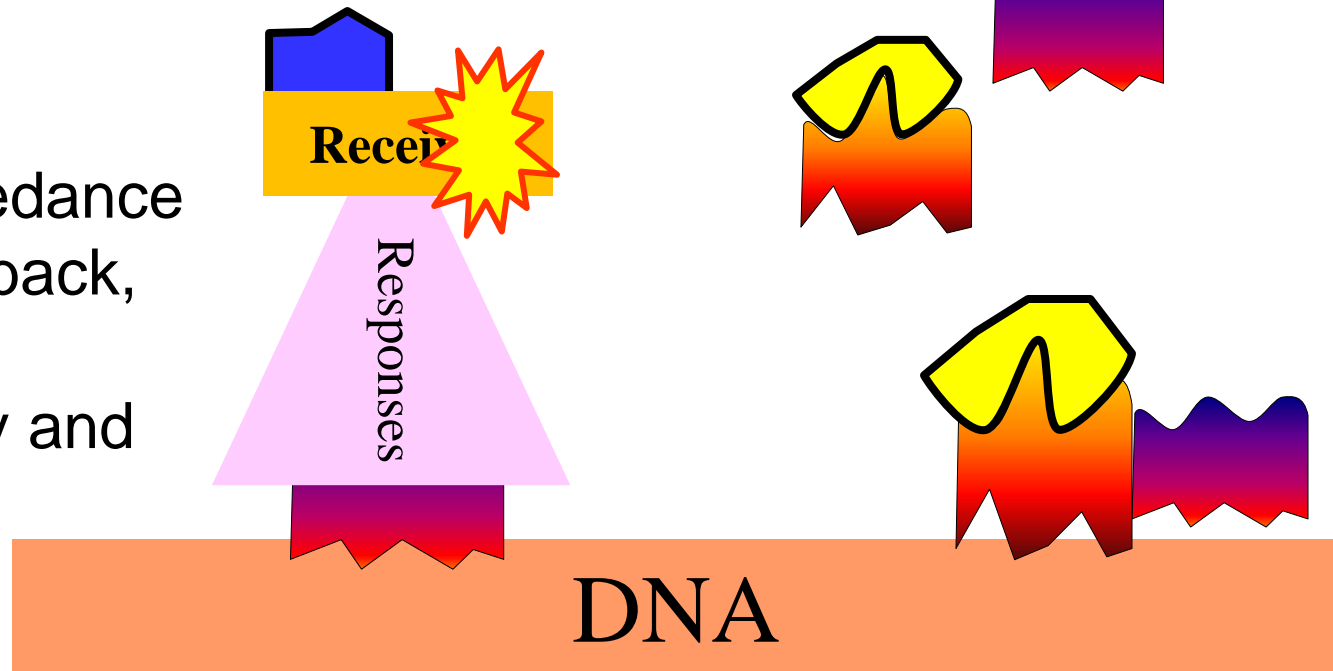
- Almost digital
- Highly programmable

“Addressing”
= molecular recognition
= localized spatially

DNA

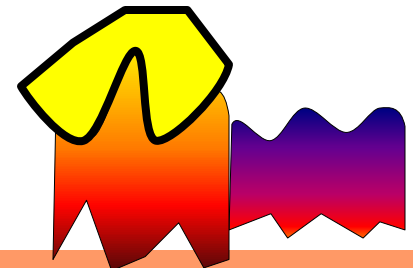
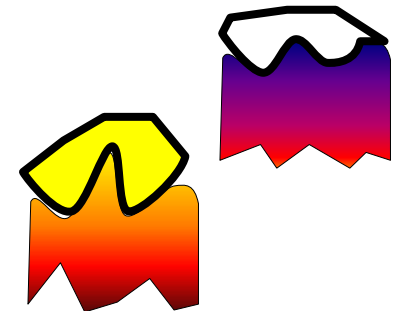
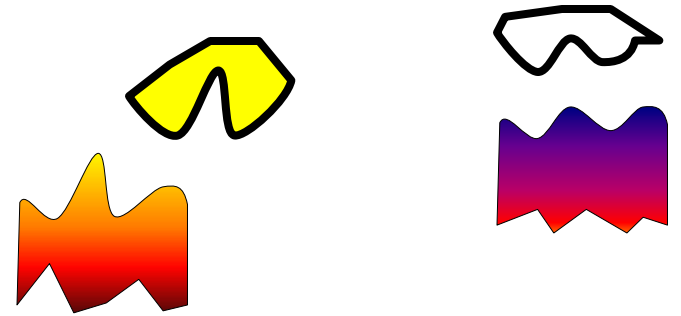


2CST systems provide speed, flexibility, external sensing, computation, impedance match, more feedback, but greater complexity and overhead



There are simpler transcription factors for sensing internal states

There are simpler
transcription
factors for sensing
internal states

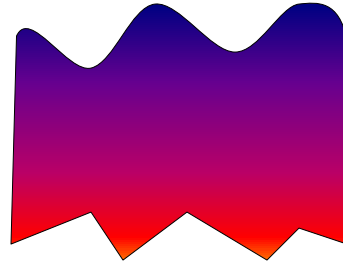


DNA

Domains can be evolved independently or coordinated.

Highly evolvable architecture.

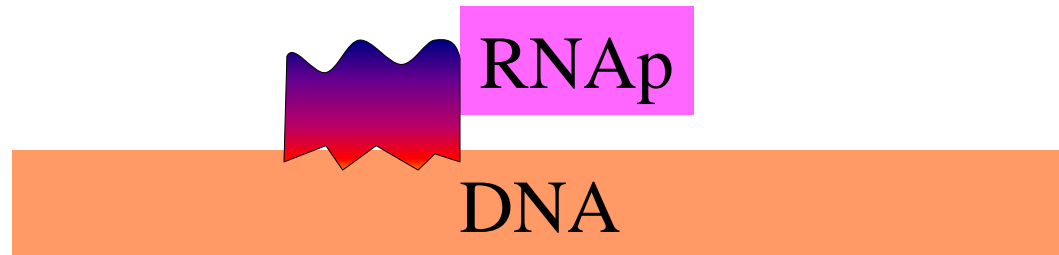
Sensor domains



DNA and RNAP binding domains

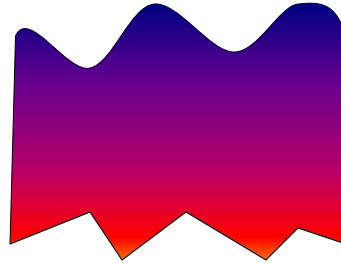
There are simpler transcription factors for sensing internal states

Application layer cannot access DNA directly.



This is like a
“name to
address”
translation.

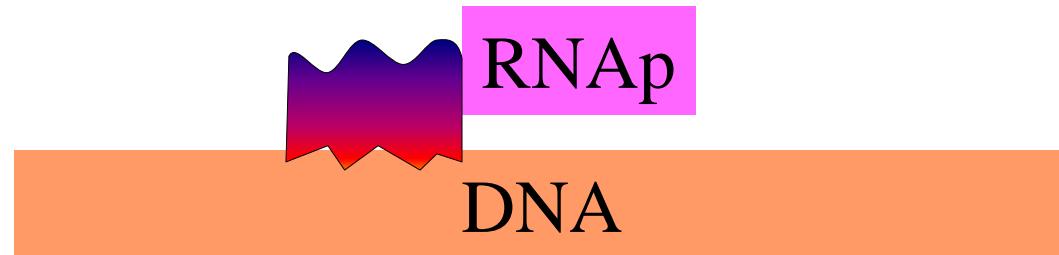
Sensor domains

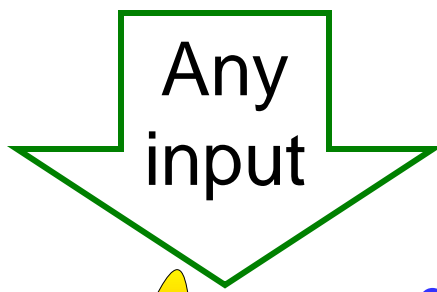


DNA and RNAP
binding domains

Sensing the
demand of the
application
layer

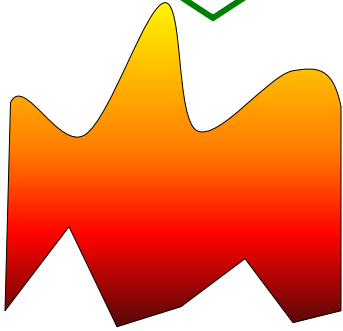
Initiating
the change
in supply



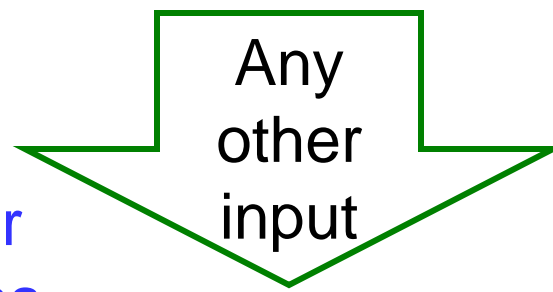


Any
input

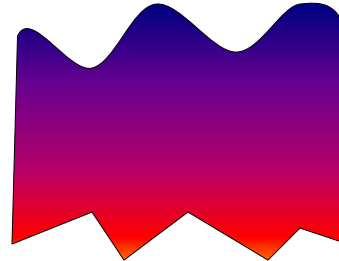
Sensor
domains



DNA and RNAP
binding domains



Any
other
input

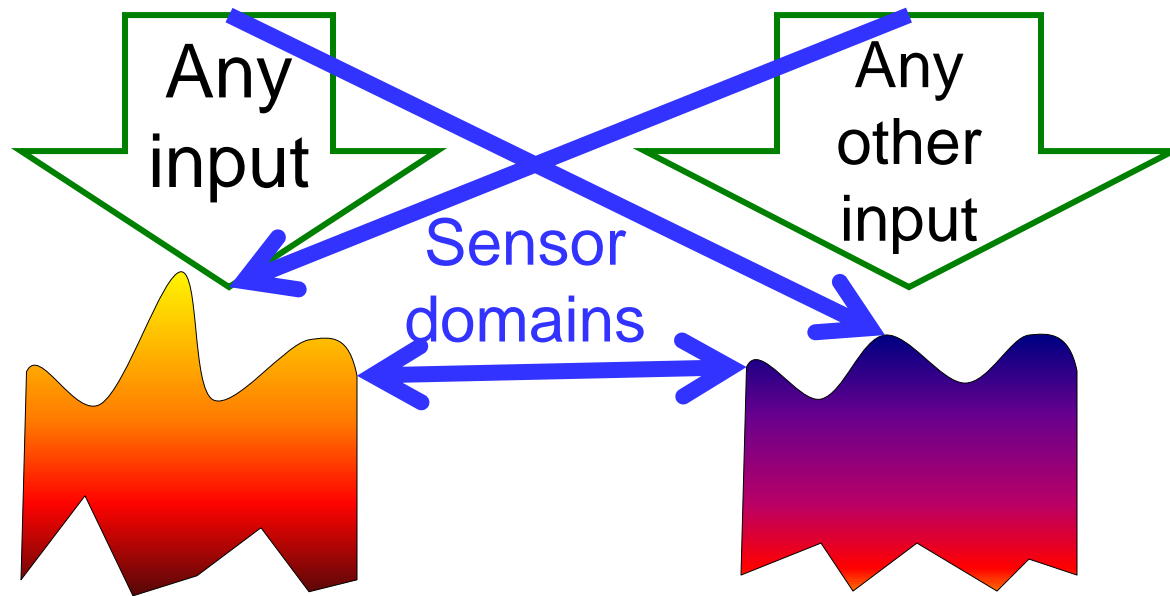


DNA and RNAP
binding domains

Sensing the
demand of the
application
layer

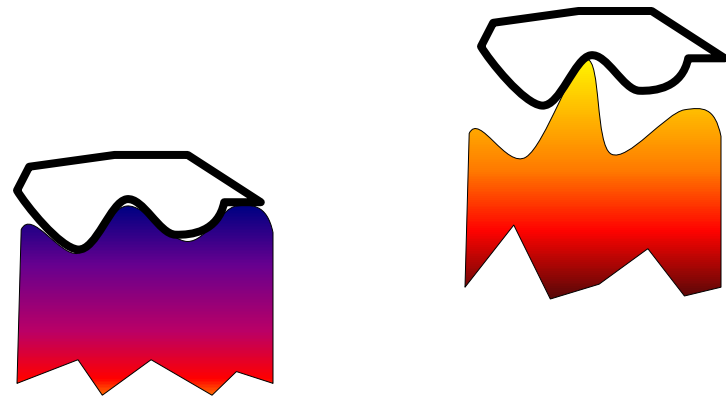
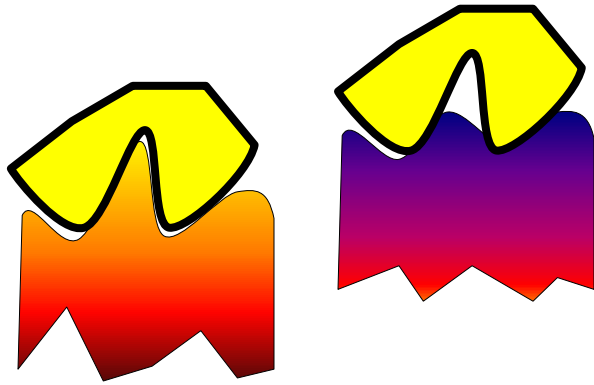
- Sensor sides attach to metabolites or other proteins
- This causes an allosteric (shape) change
- (Sensing is largely analog (# of bound proteins))
- Effecting the DNA/RNAP binding domains
- Protein and DNA/RNAP recognition is more digital
- Extensively discussed in both Ptashne and Alon

“Cross talk” can be
finely controlled



- Application layer signals can be integrated or not
- Huge combinatorial space of (mis)matching shapes
- A functionally meaningful “name space”
- Highly adaptable architecture
- Interactions are fast (but expensive)
- Return to this issue in “signal transduction”

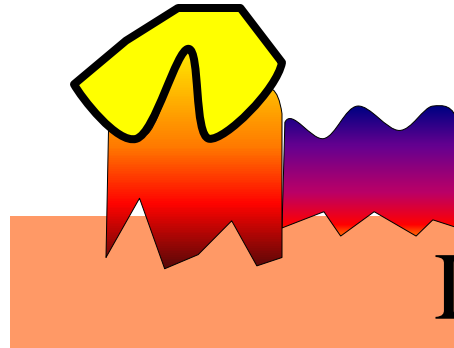
“Name” recognition
= molecular recognition
= localized functionally
= global spatially



Transcription factors
do “name” to “address”
translation

Both are

- Almost digital
- Highly programmable

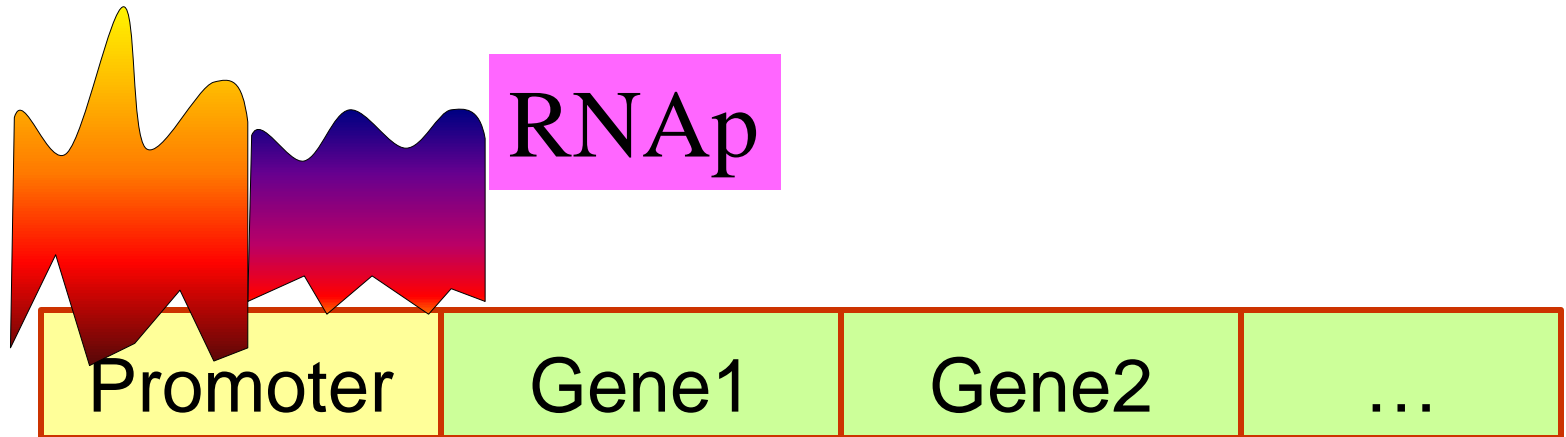


DNA

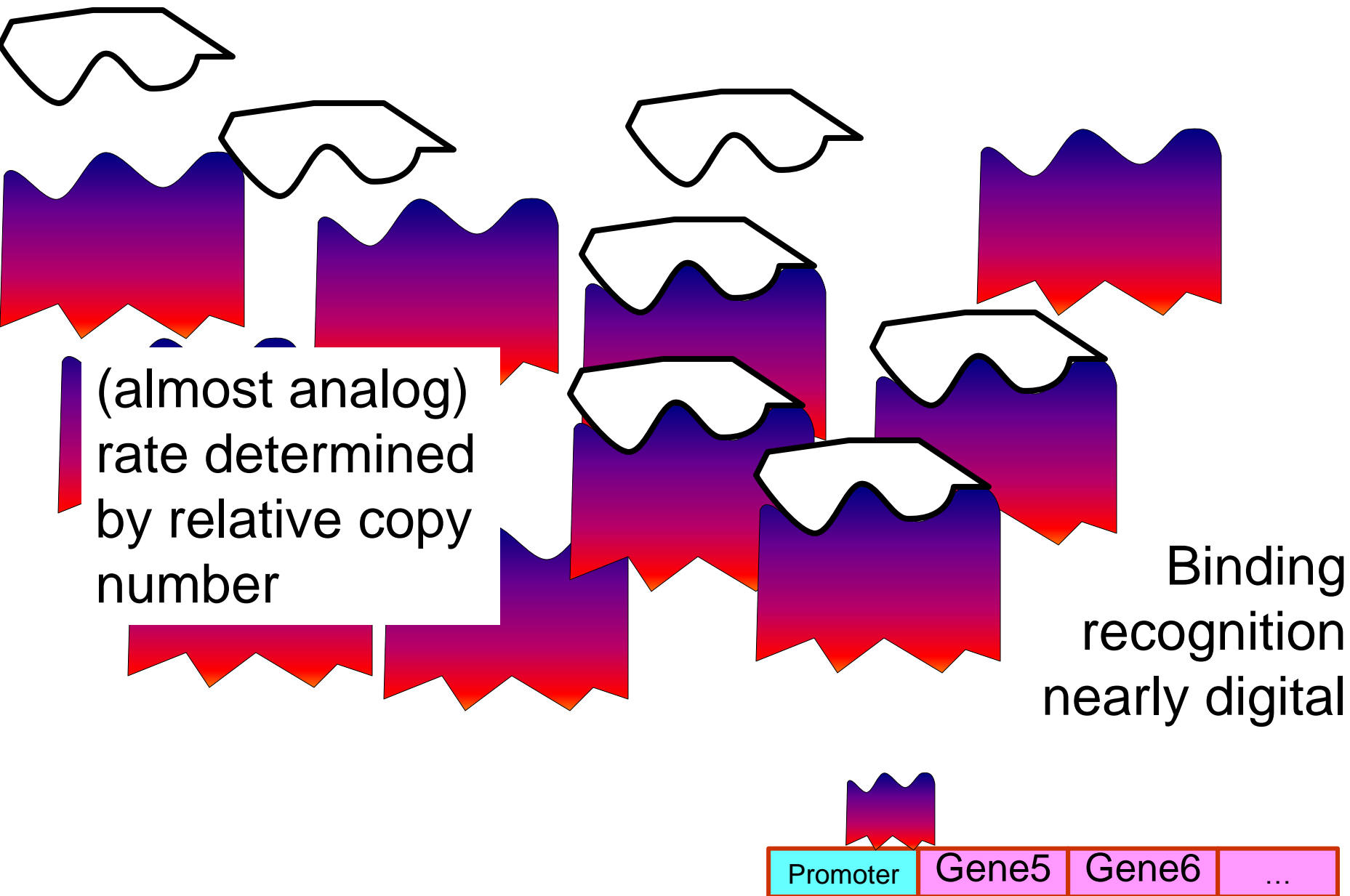
“Addressing”
= molecular recognition
= localized spatially

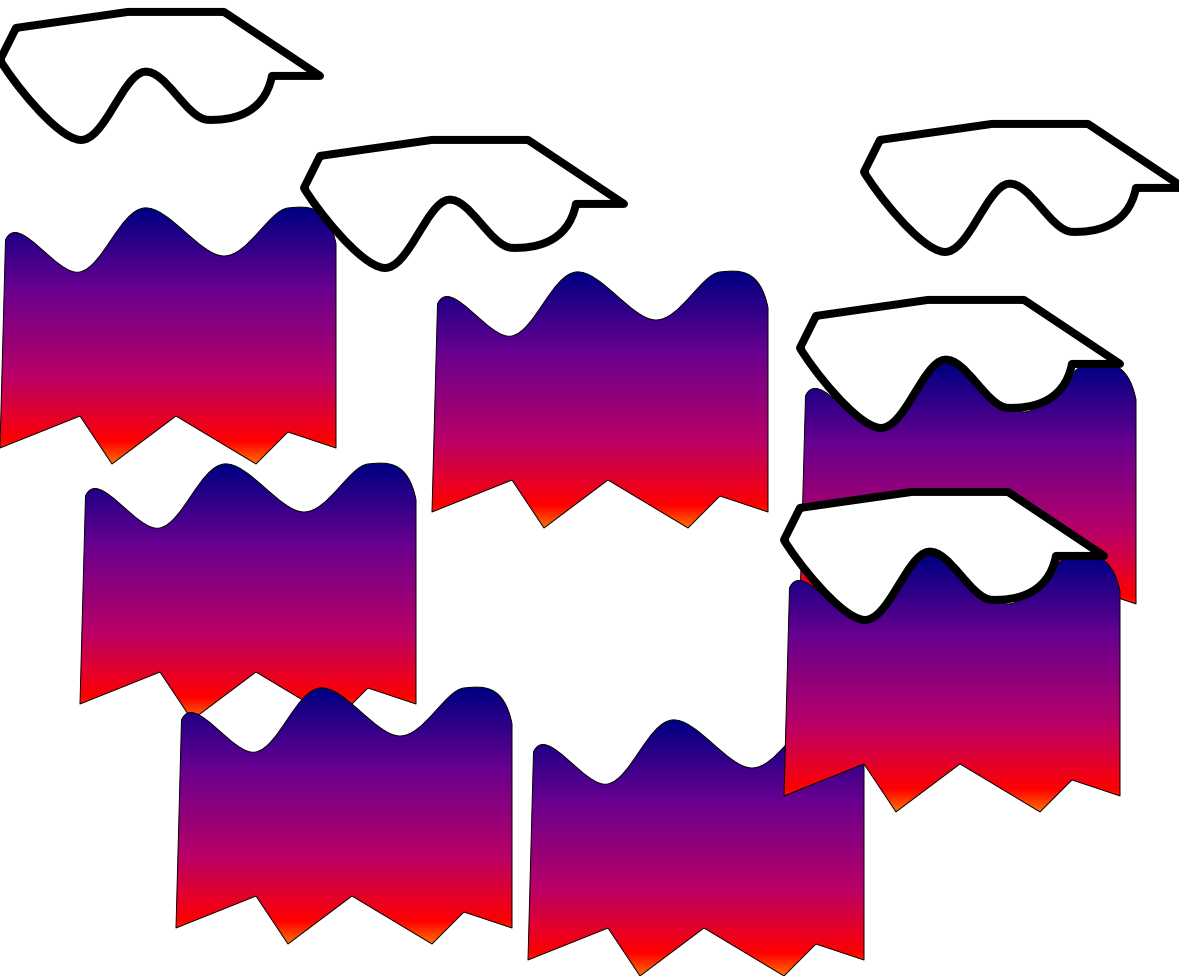
Can activate
or repress

And work in
complex logical
combinations



- Both protein and DNA sides have sequence/shape
- Huge combinatorial space of “addresses”
- Modest amount of “logic” can be done at promoter
- Transcription is very noise (but efficient)
- Extremely adaptable architecture





Recall: can work by
pulse code
modulation so for
small copy number
does digital to
analog conversion

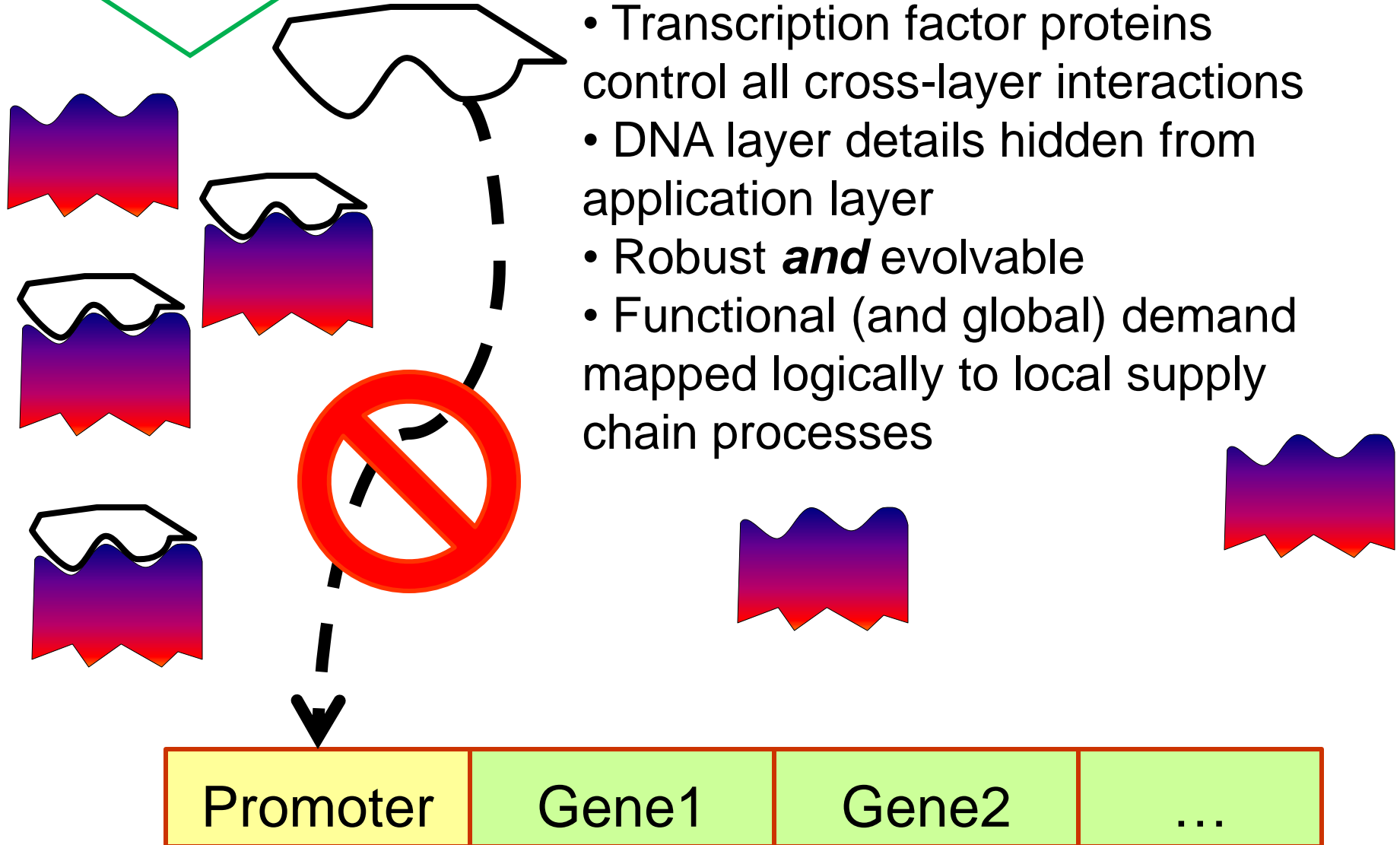
rate (almost analog)
determined by copy number

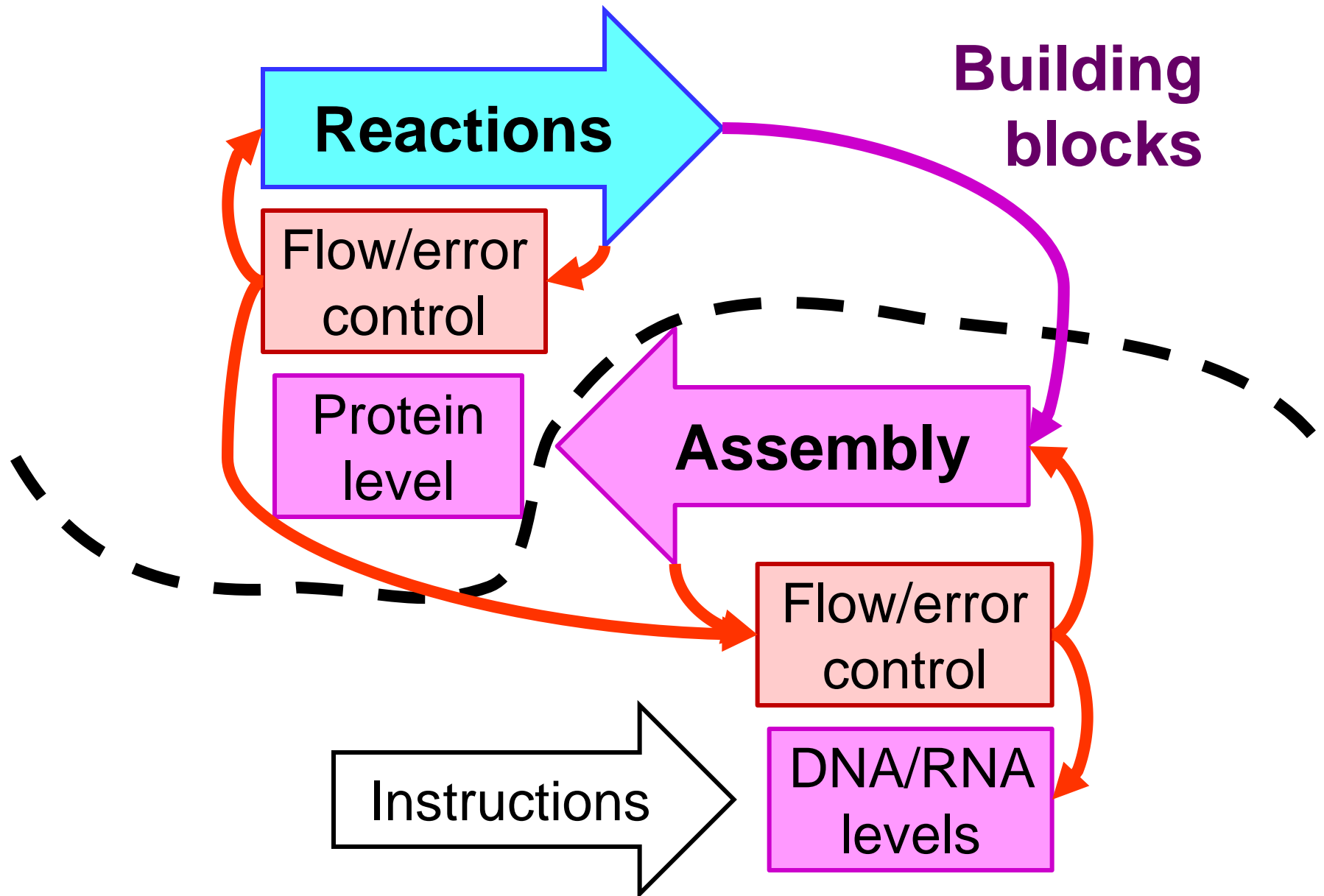


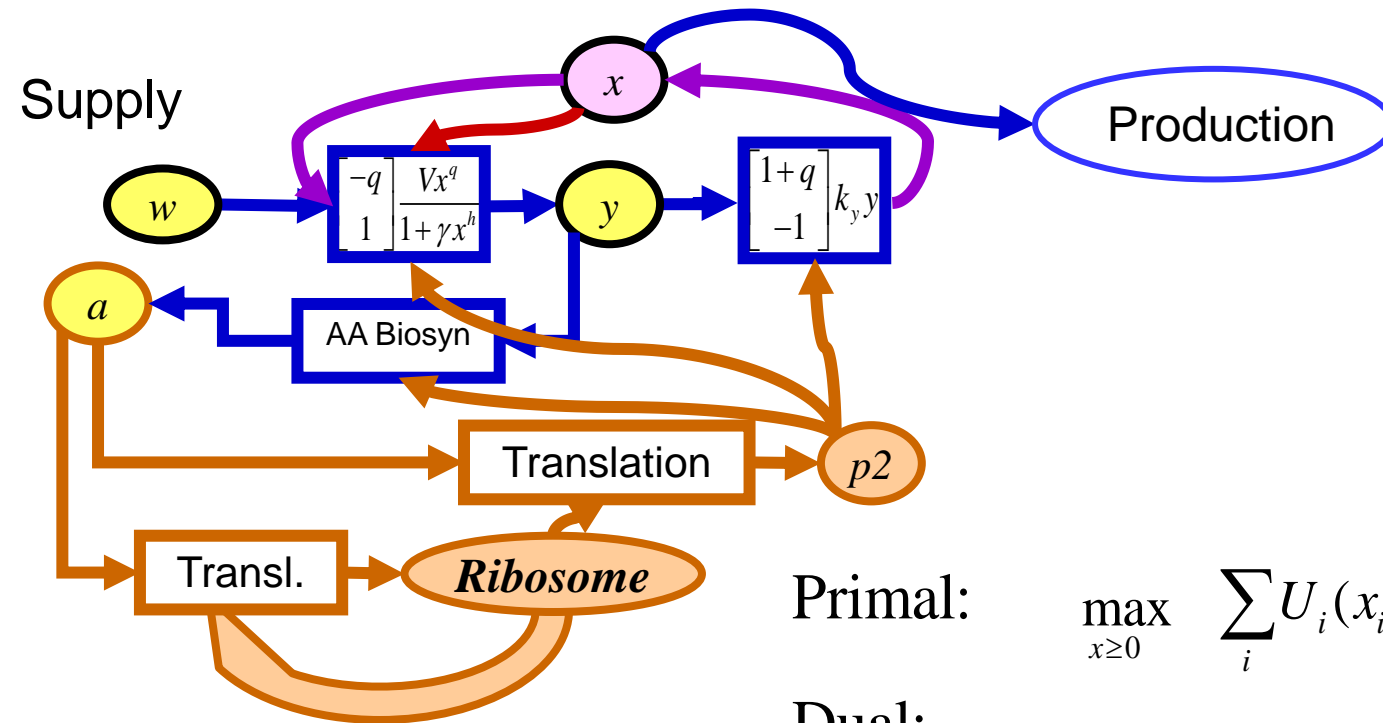
Any
input

No crossing layers

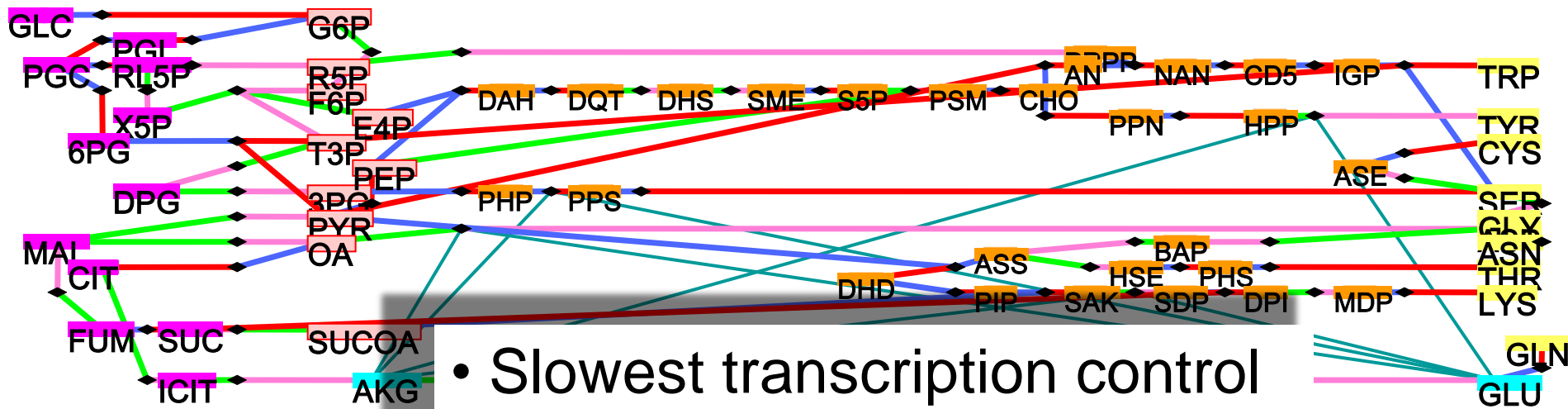
- Highly structured interactions
- Transcription factor proteins control all cross-layer interactions
- DNA layer details hidden from application layer
- Robust **and** evolvable
- Functional (and global) demand mapped logically to local supply chain processes



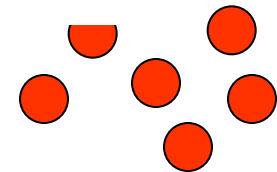
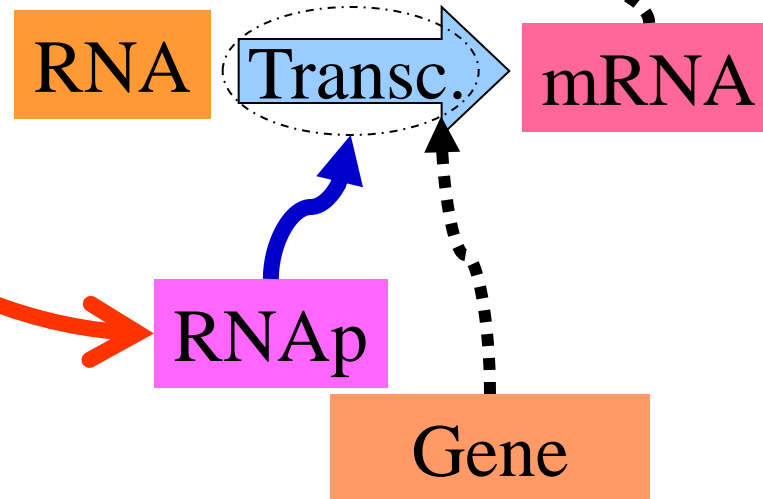
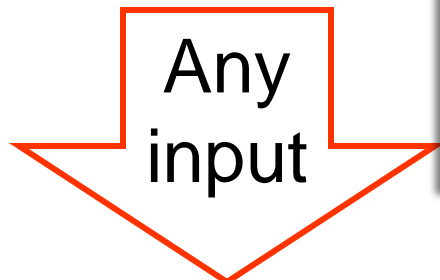




No duality gaps?
 Multipath routing?
 Coherent pricing?



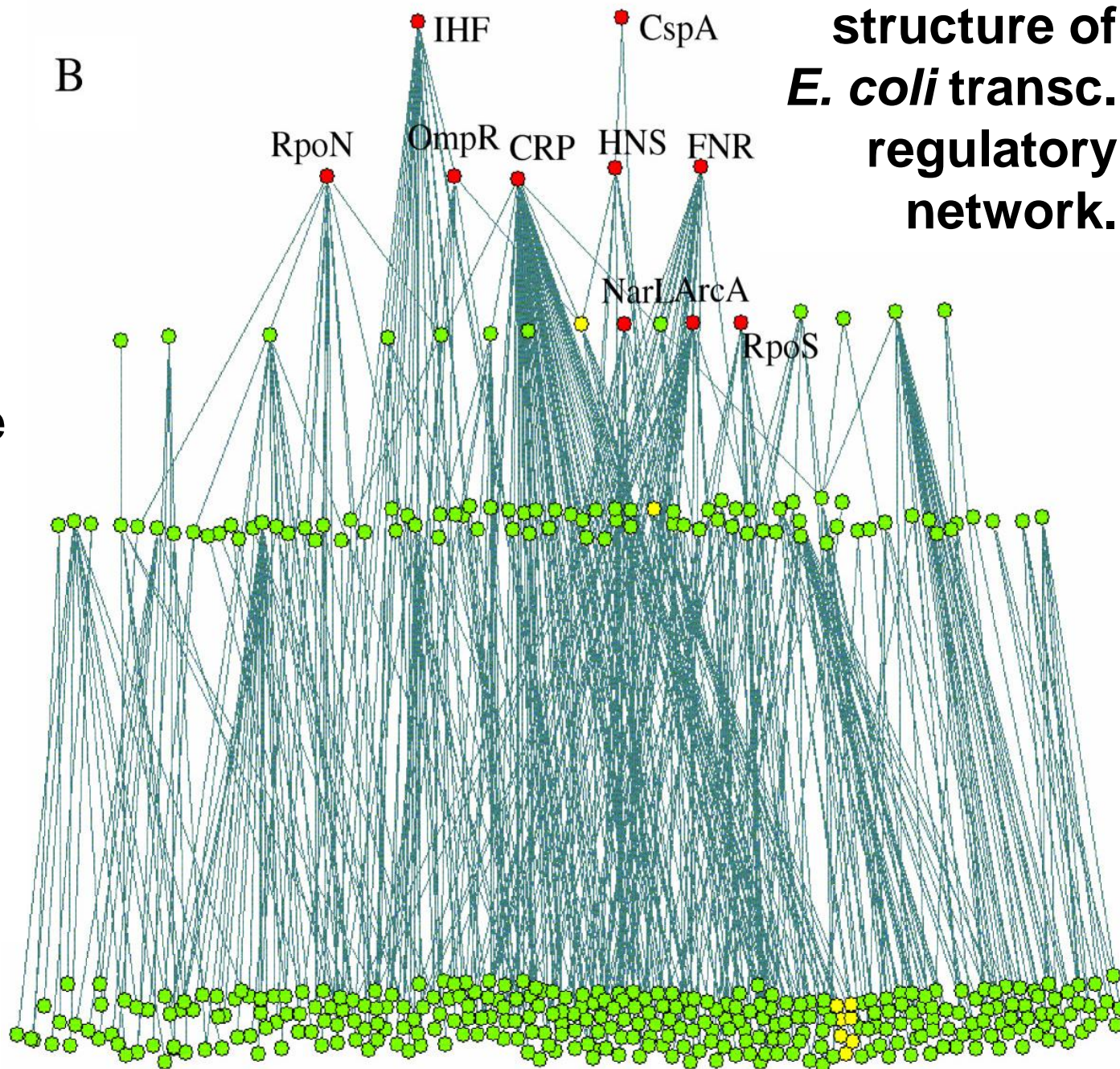
- Slowest transcription control
- Complex transcription factors
- Lowest metabolic overhead
- Easily reprogrammed

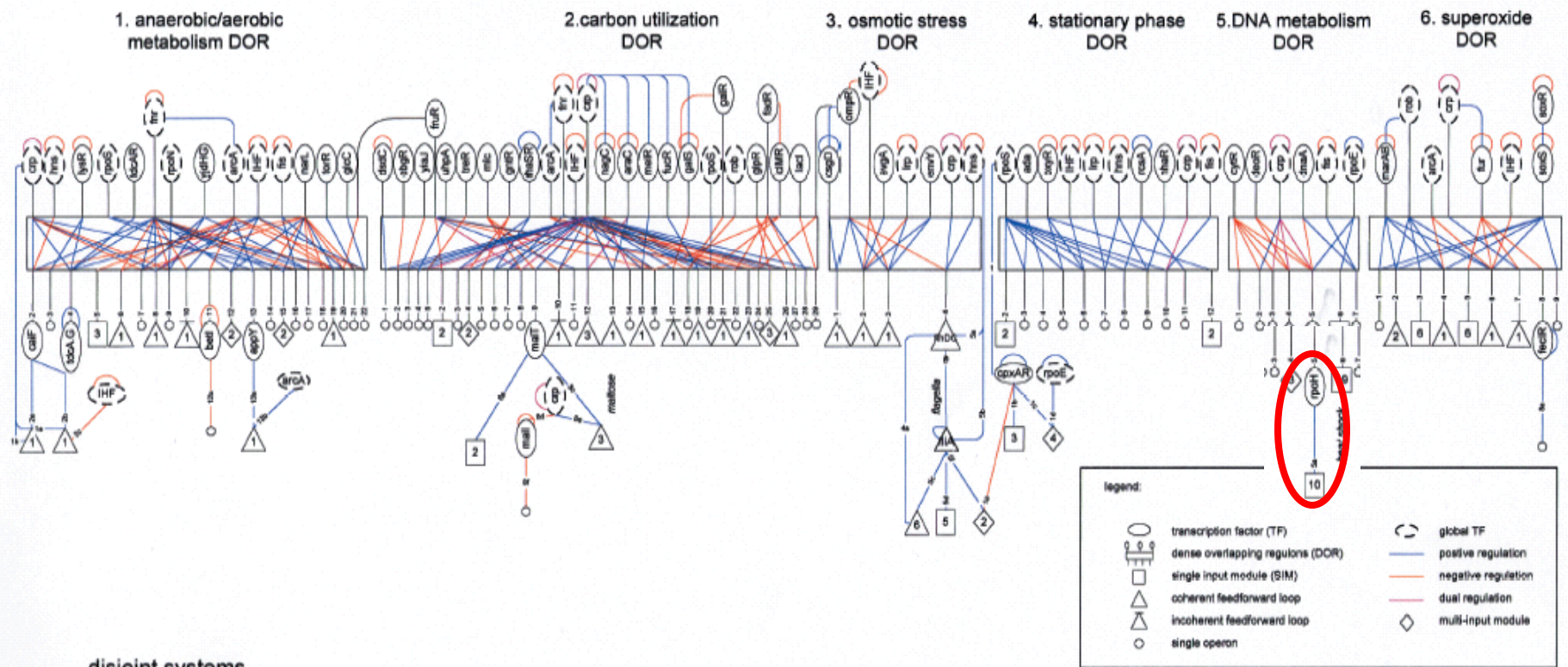


All transcriptional regulatory links are downward. Nodes are operons. Global regulators are red. Yellow marked nodes are operons in the longest regulatory pathway related with flagella motility.

Ma *et al.* *BMC Bioinformatics* 2004
5:199 doi:10.1186/1471-2105-5-199

Hierarchical structure of *E. coli* transcr. regulatory network.





disjoint systems

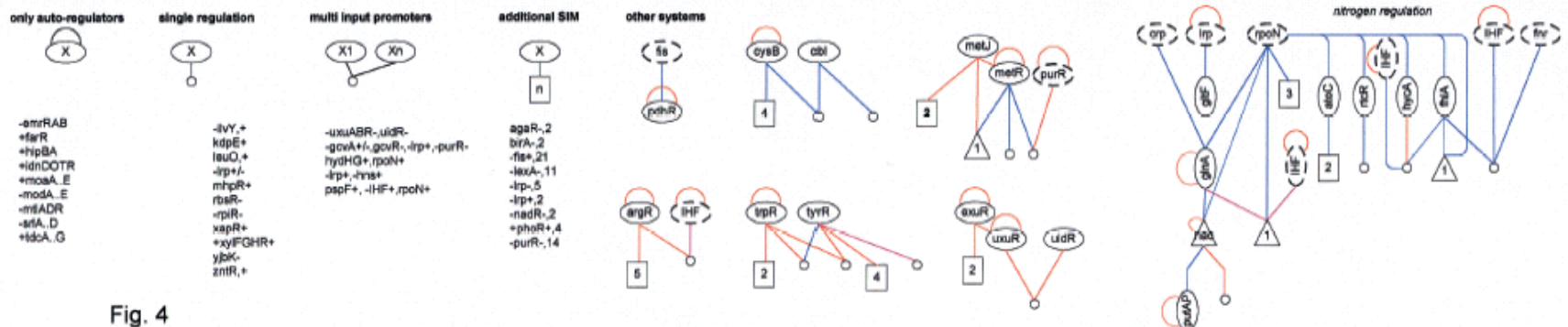
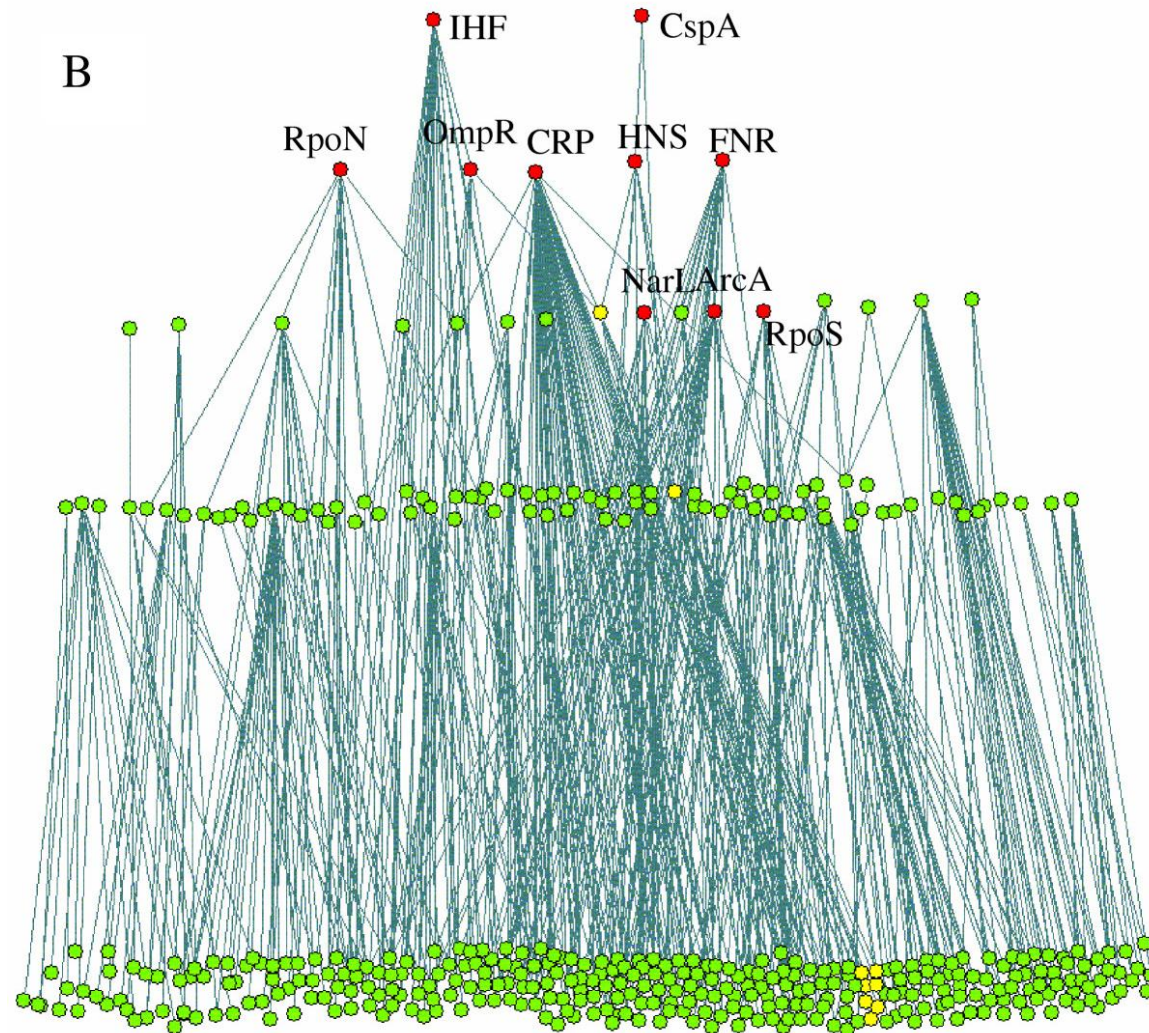


Fig. 4

Note: all feedback in this picture has been removed in two ways:

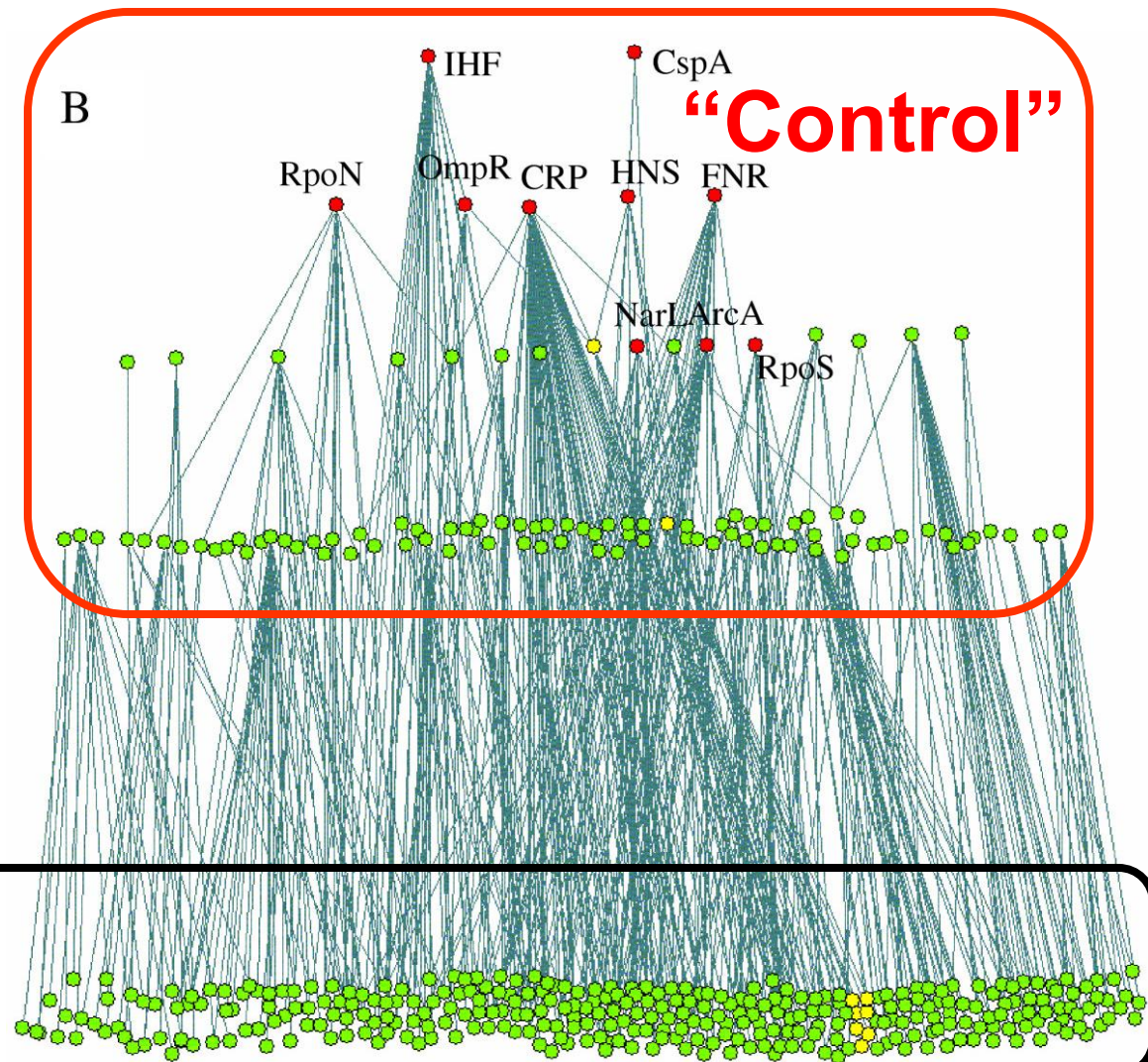
- 1) There are self-loops where an operon is controlled by one of its own genes
- 2) All the real complex control is in the protein interactions not shown (e.g. see heat shock details)

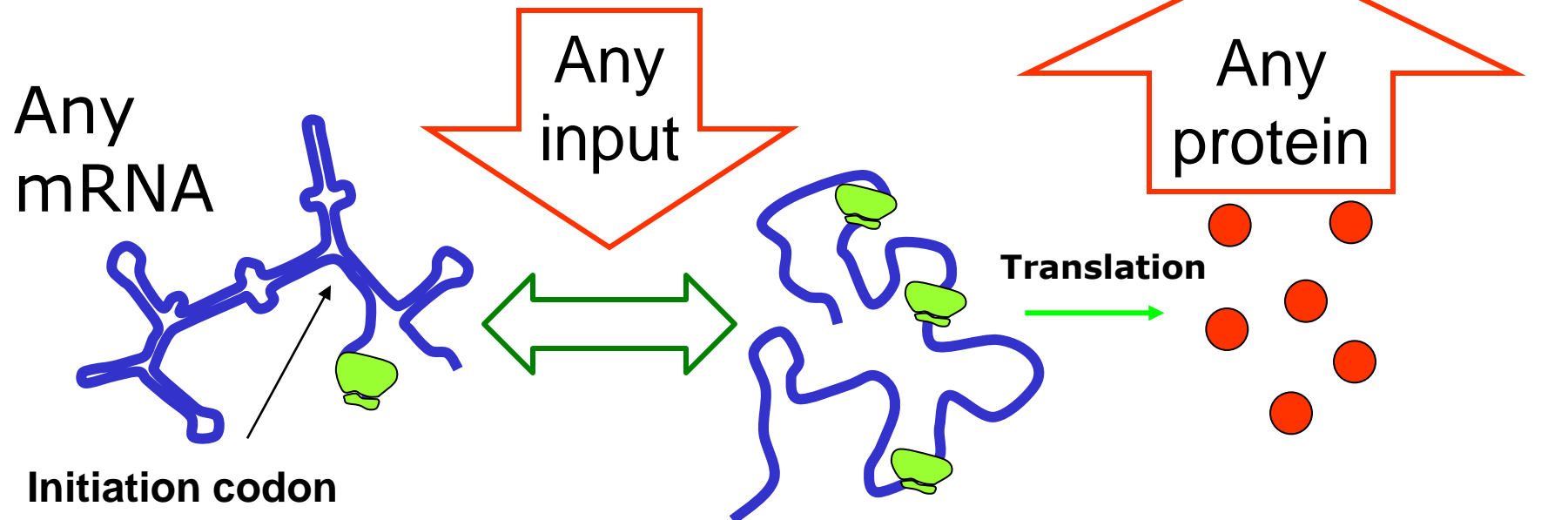
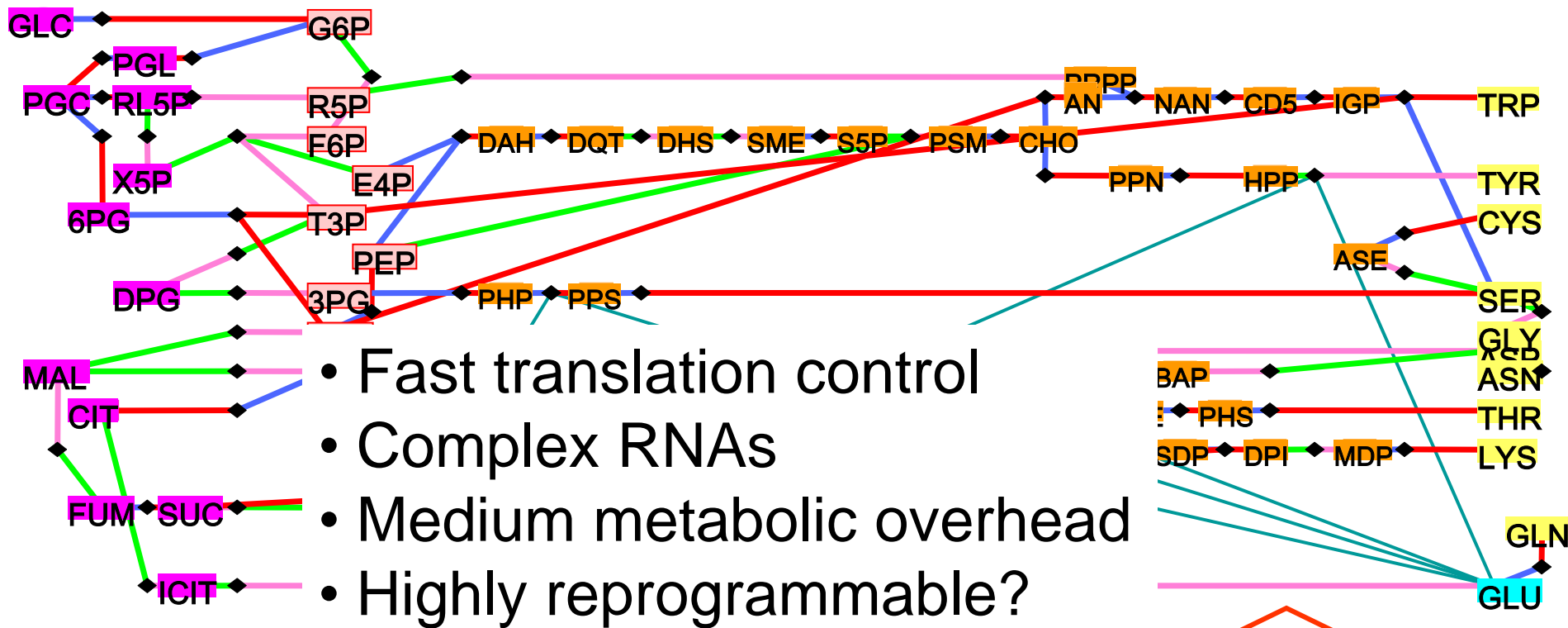
These are not really ***control*** systems, they just initiate manufacturing

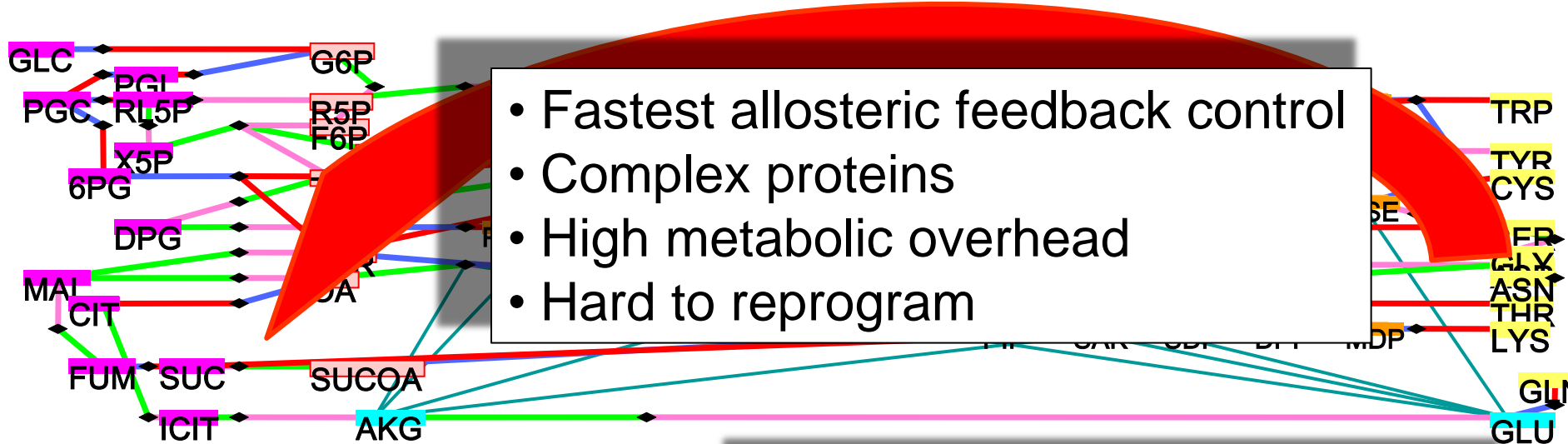


This architecture has limited scalability:

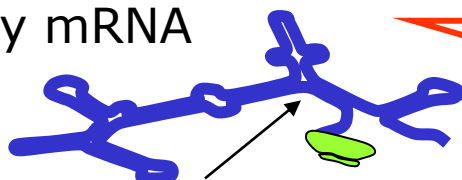
- 1) Fast diffusion can only work in small volumes
- 2) The number of proteins required for control grows superlinearly with the number of enzymes (Mattick)







Any mRNA



Initiation codon

Any input

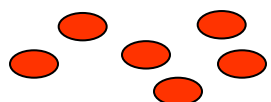
- Fast translation control
- Complex RNAs
- Medium metabolic overhead
- Highly reprogrammable?

Any

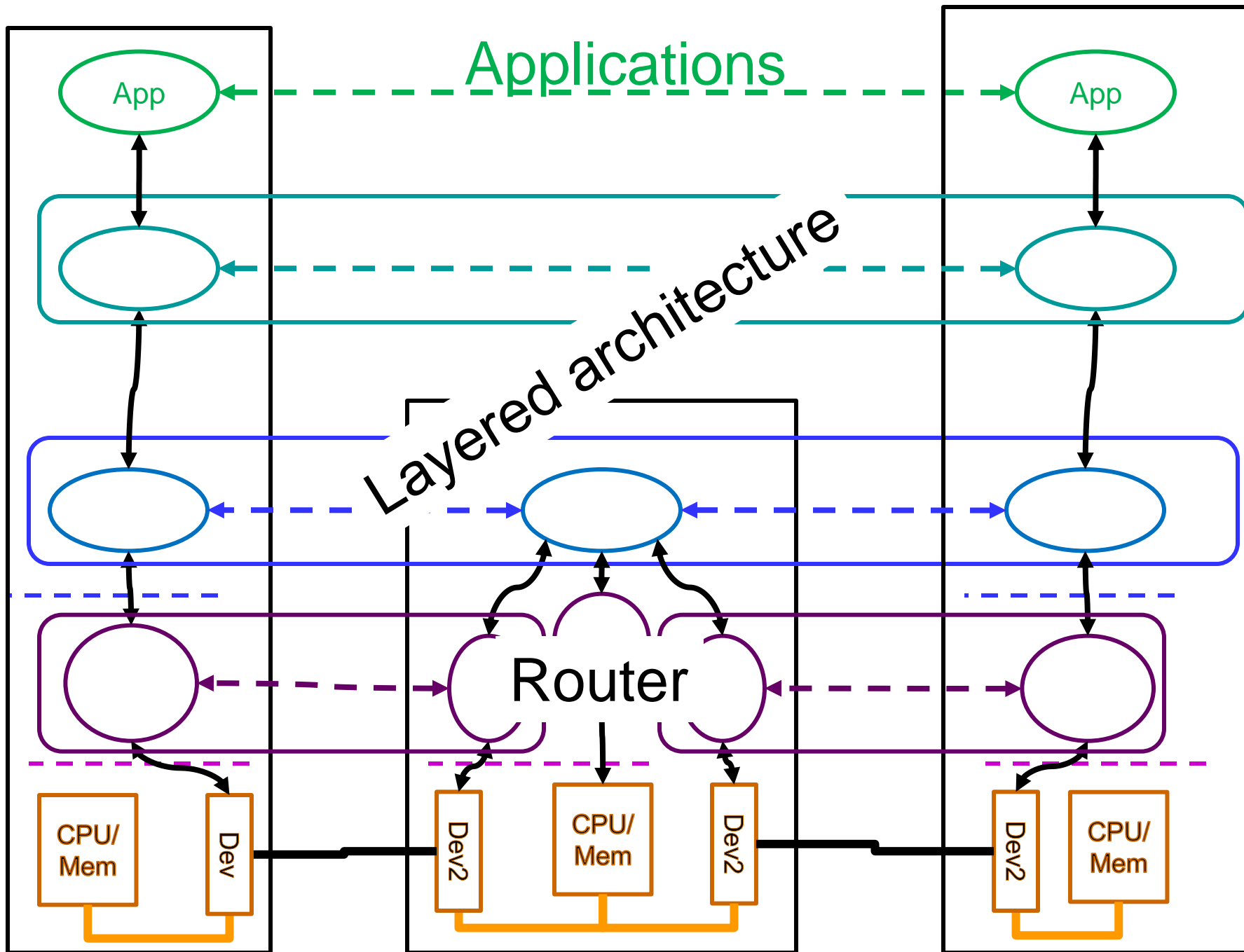
- Slowest transcription control
- Complex transcription factors
- Lowest metabolic overhead
- Easily reprogrammed

Enzymes

mRNA



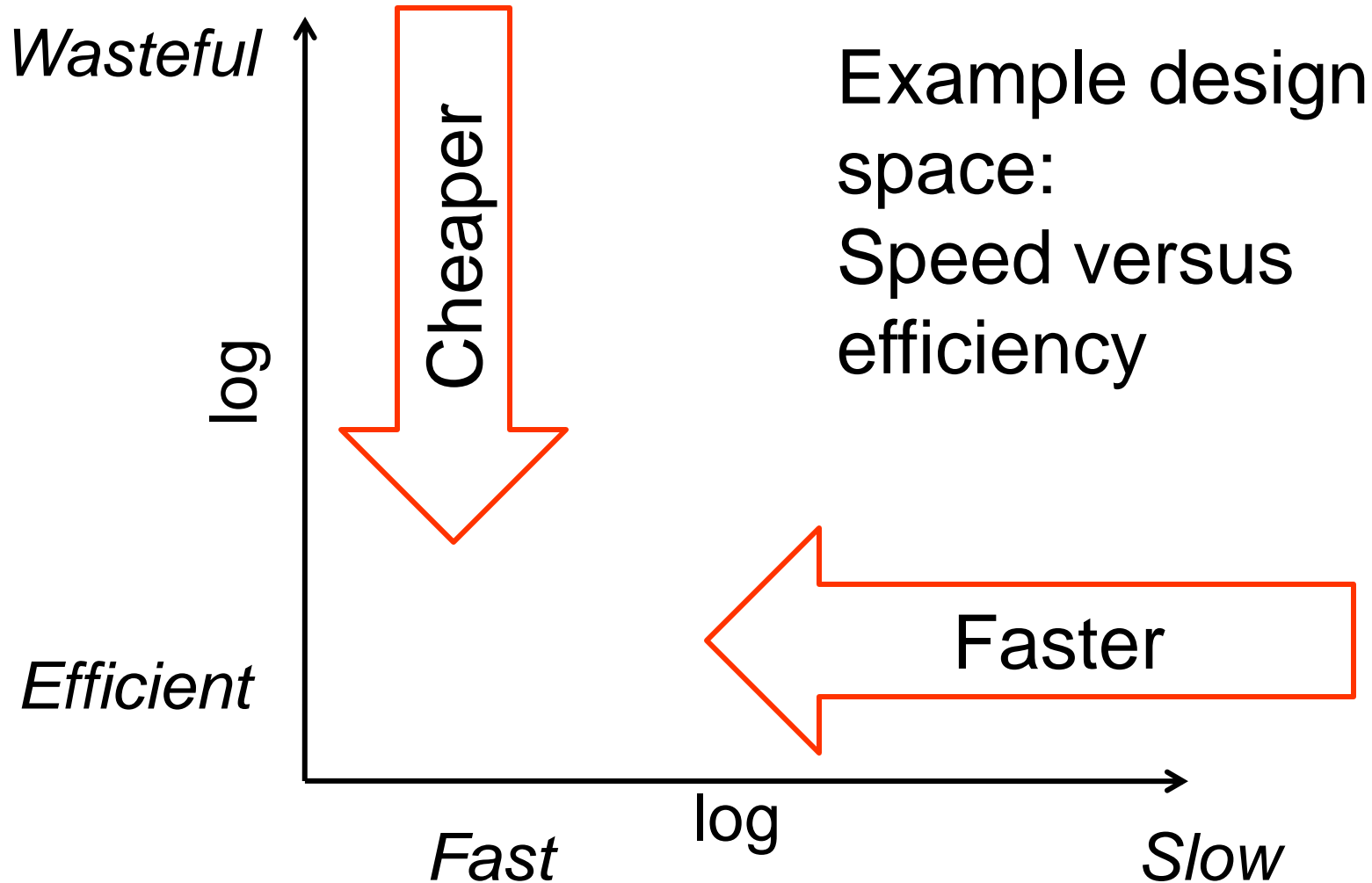
Gene



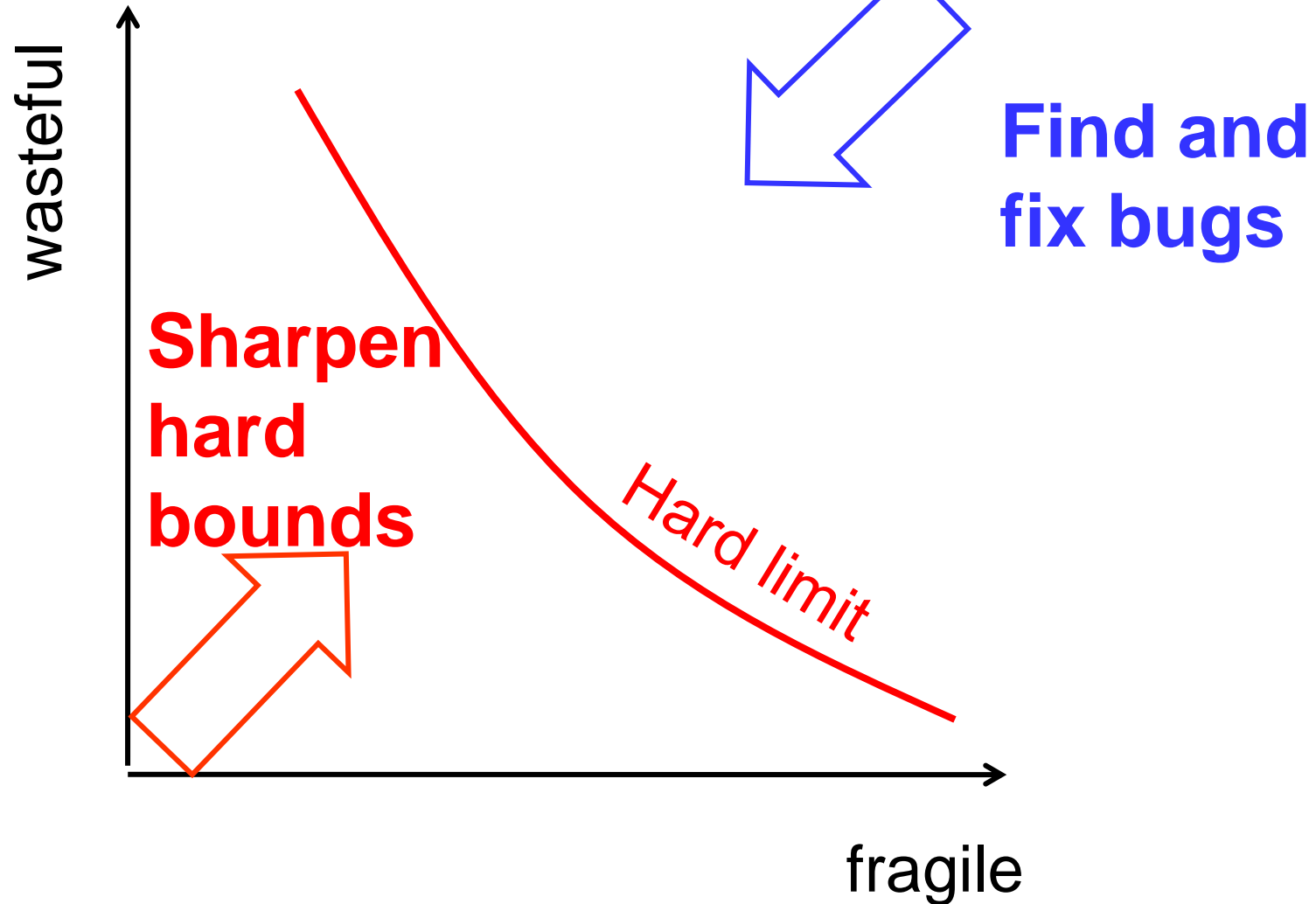
Clean slate layering?

- Two “macrolayers” with a new, higher “waist”
 - Upper: Managing content, function, naming
 - Lower: Managing physical resources, addressing
- Lower layers: map to physical addresses (PNA)
 - Recursive “microlayers” of control and management
 - Different scopes (more global and lumped to more local and detailed)
 - No global addresses, hide details, addresses
- Cleaner role of optimization and control?
- Integration with naming and addressing
- Align robustness and security

Design tradeoffs

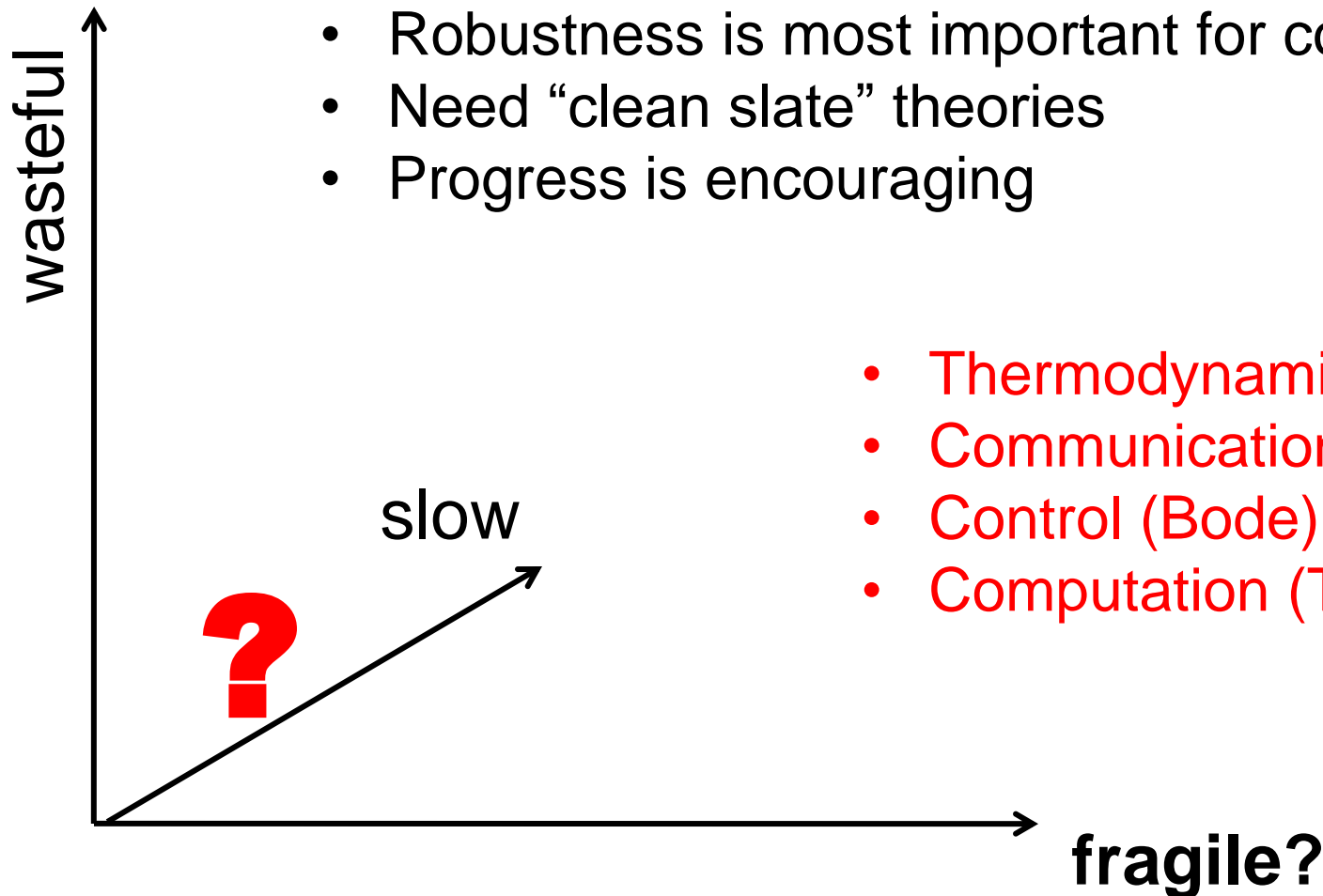


Complementary approaches



Standard theories are severely limited

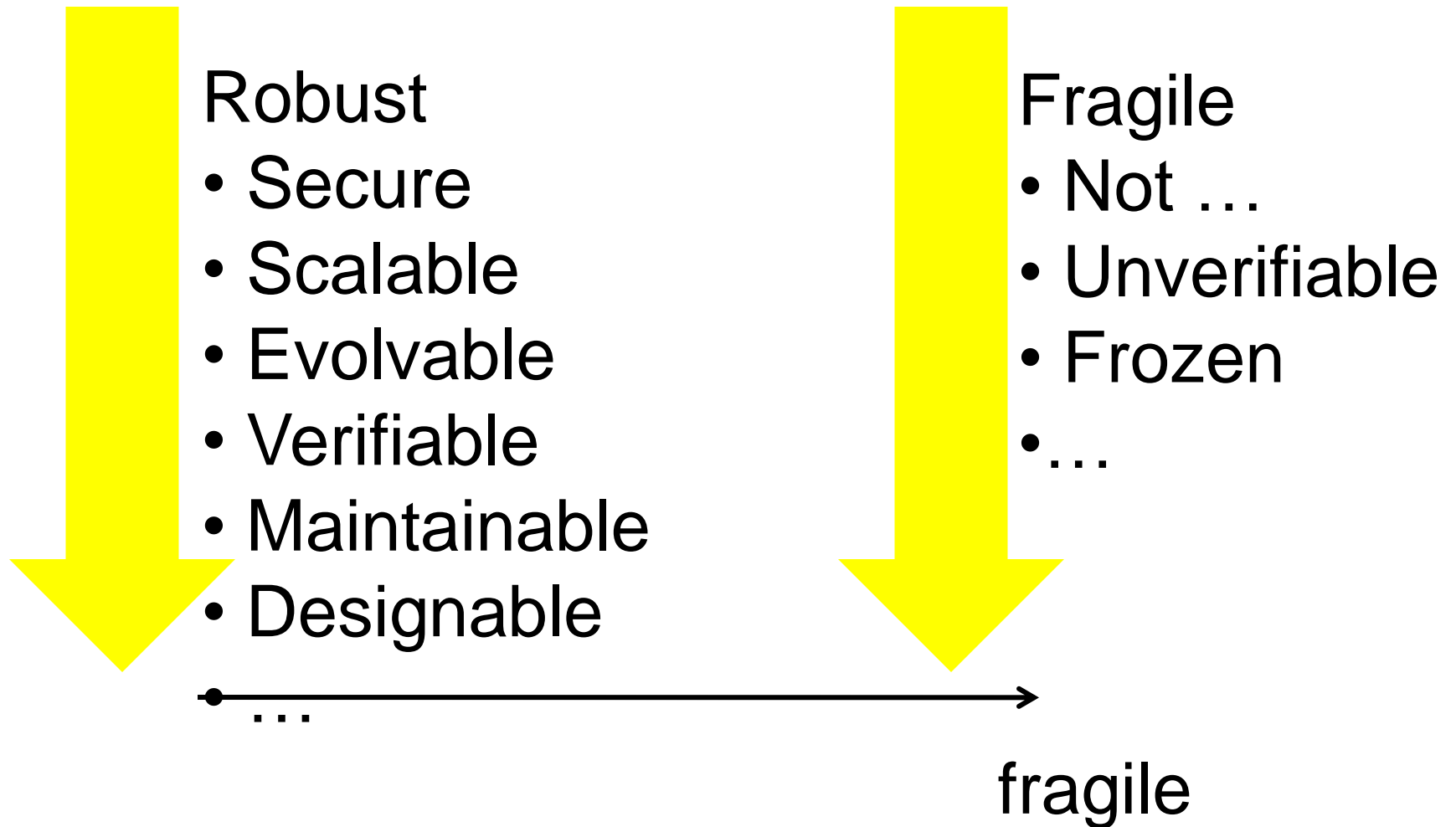
- Each focuses on few dimensions
- Important tradeoffs are **across** these dimensions
- Speed vs efficiency vs robustness vs ...
- Robustness is most important for complexity
- Need “clean slate” theories
- Progress is encouraging



- Thermodynamics (Carnot)
- Communications (Shannon)
- Control (Bode)
- Computation (Turing)

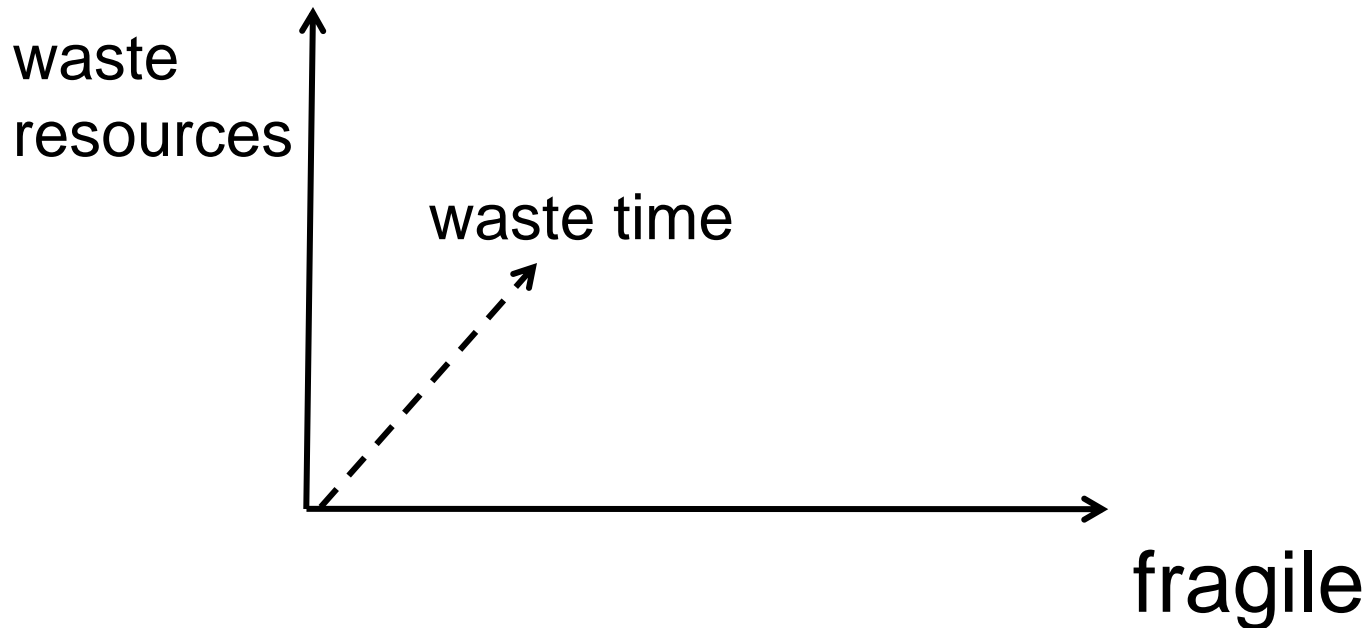
Most dimensions are robustness

Collapse for visualization



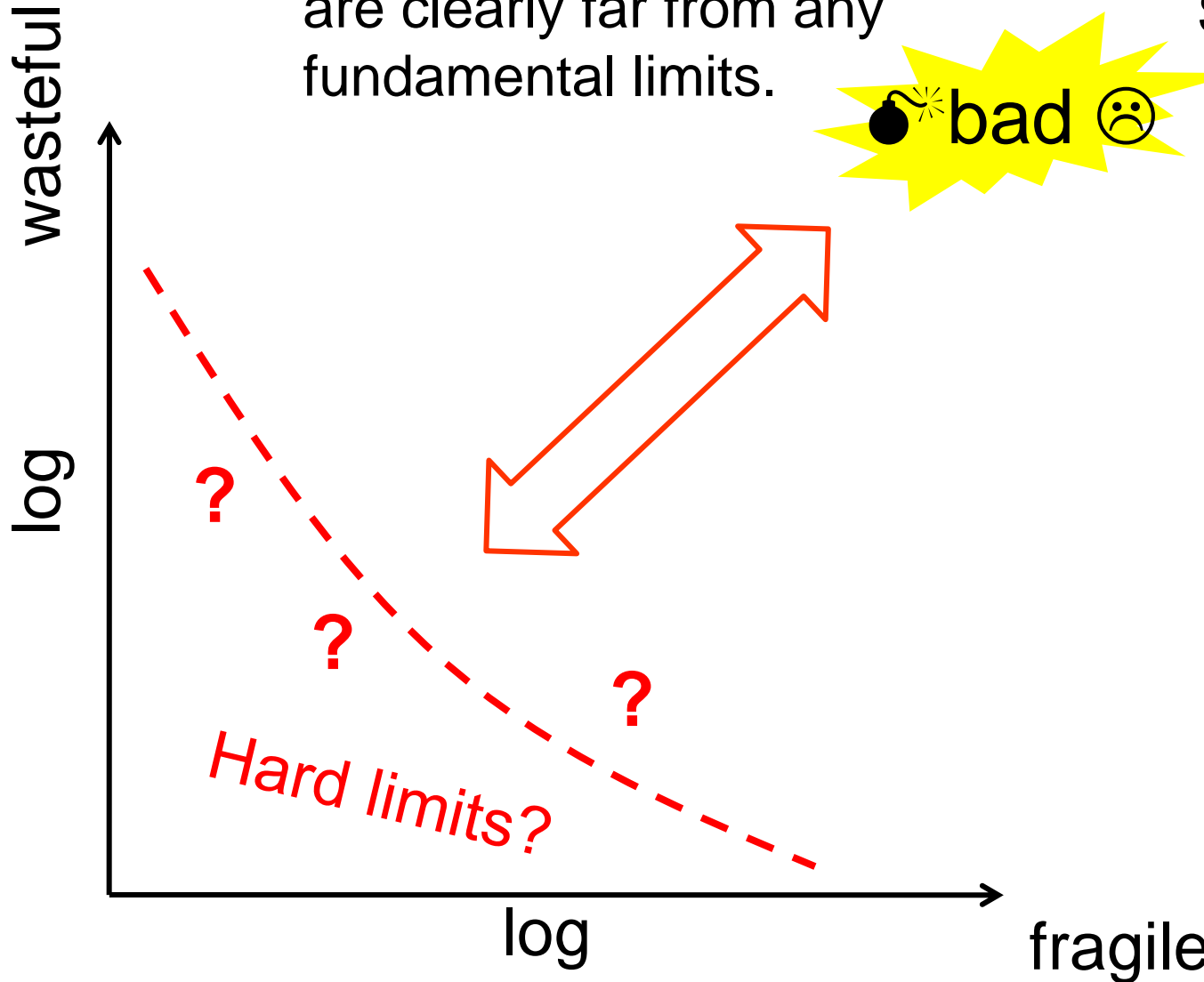
- Important tradeoffs are **across** these dimensions
- Speed vs efficiency vs robustness vs ...
- Robustness is most important for complexity
- Collapse efficiency dimensions

wasteful



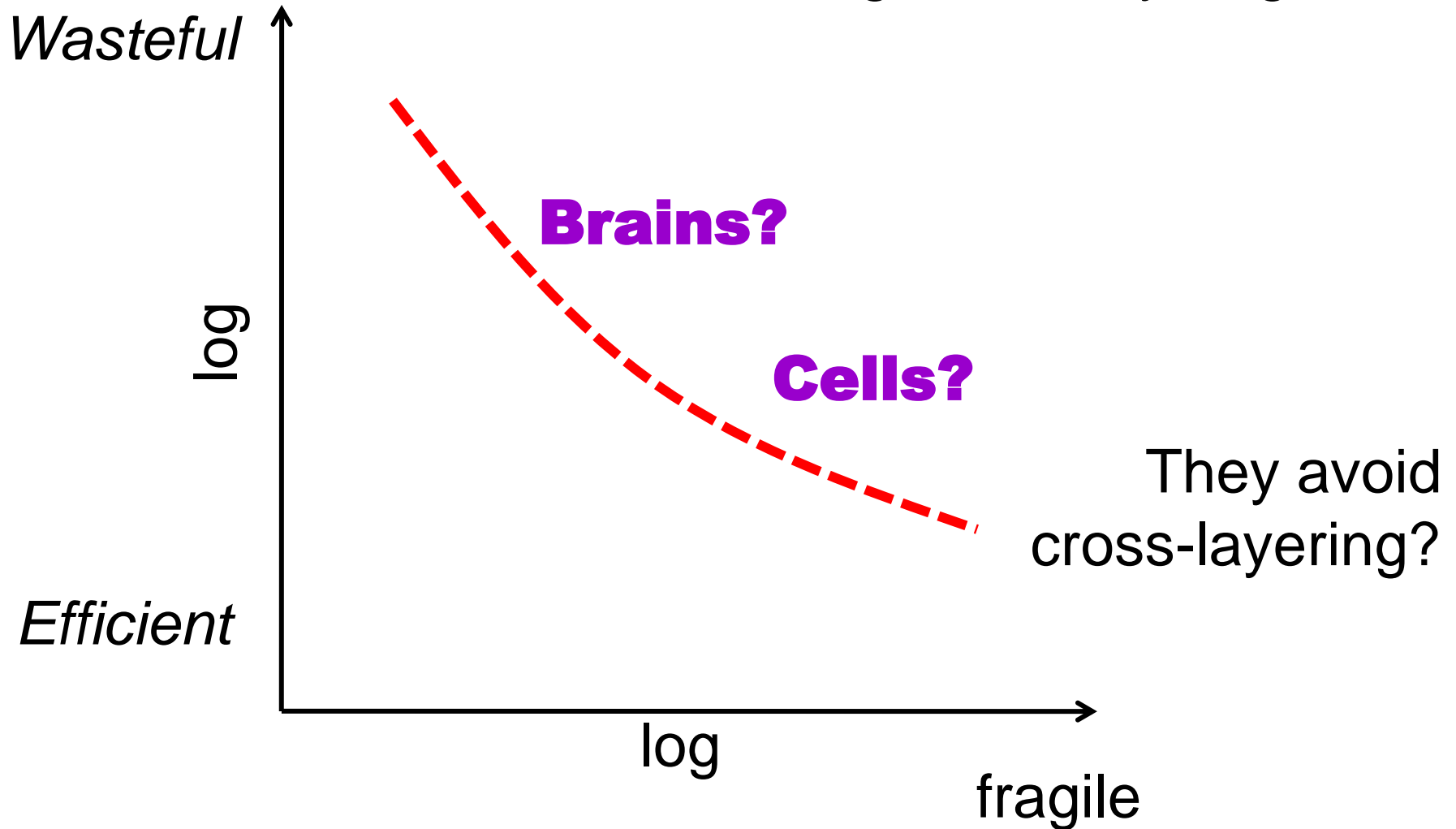
But many existing systems and architectures are clearly far from any fundamental limits.

So fixing “bugs” in existing architectures has most immediate impact.

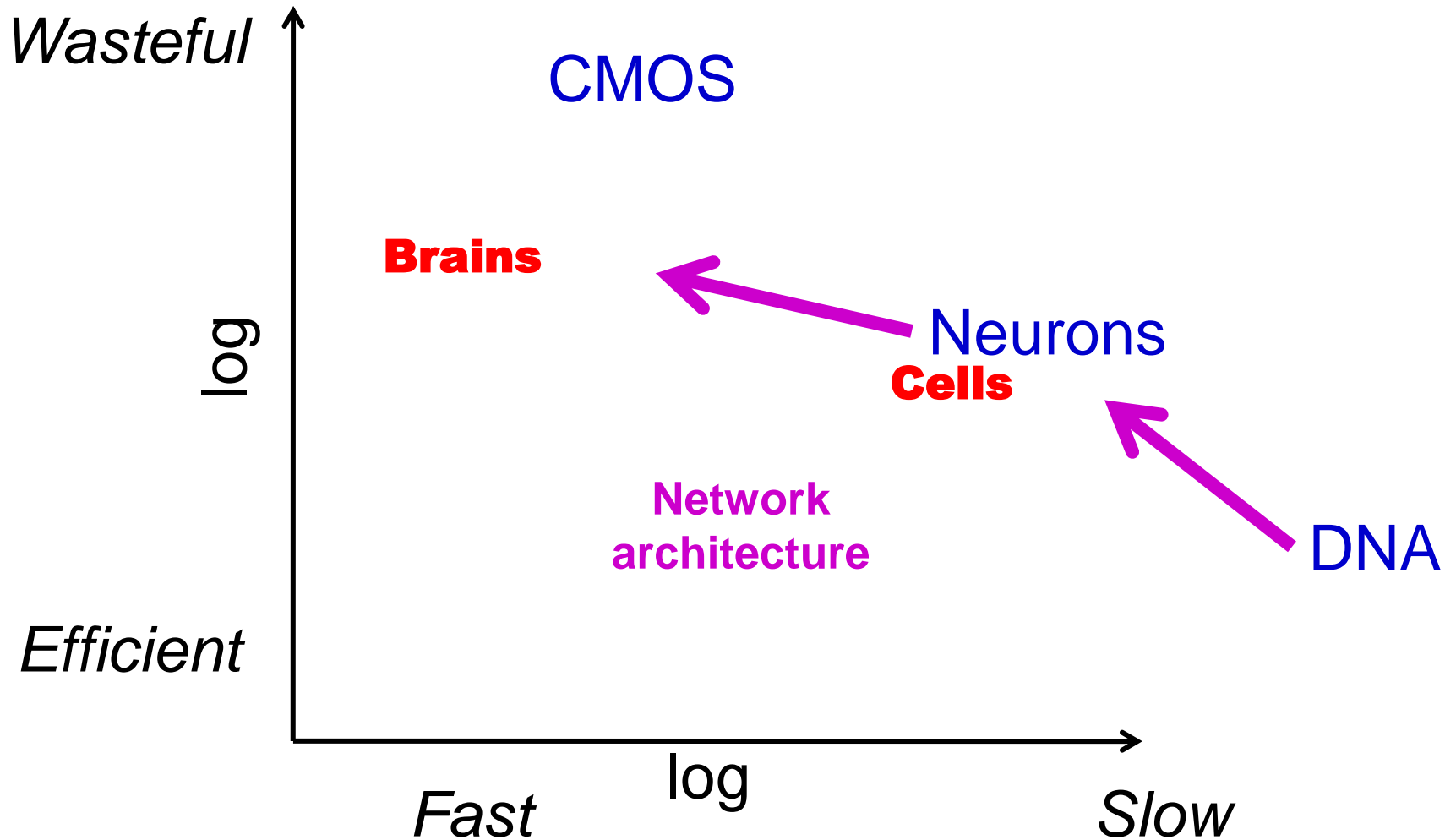


Note: “log” suggests orders of magnitude variations

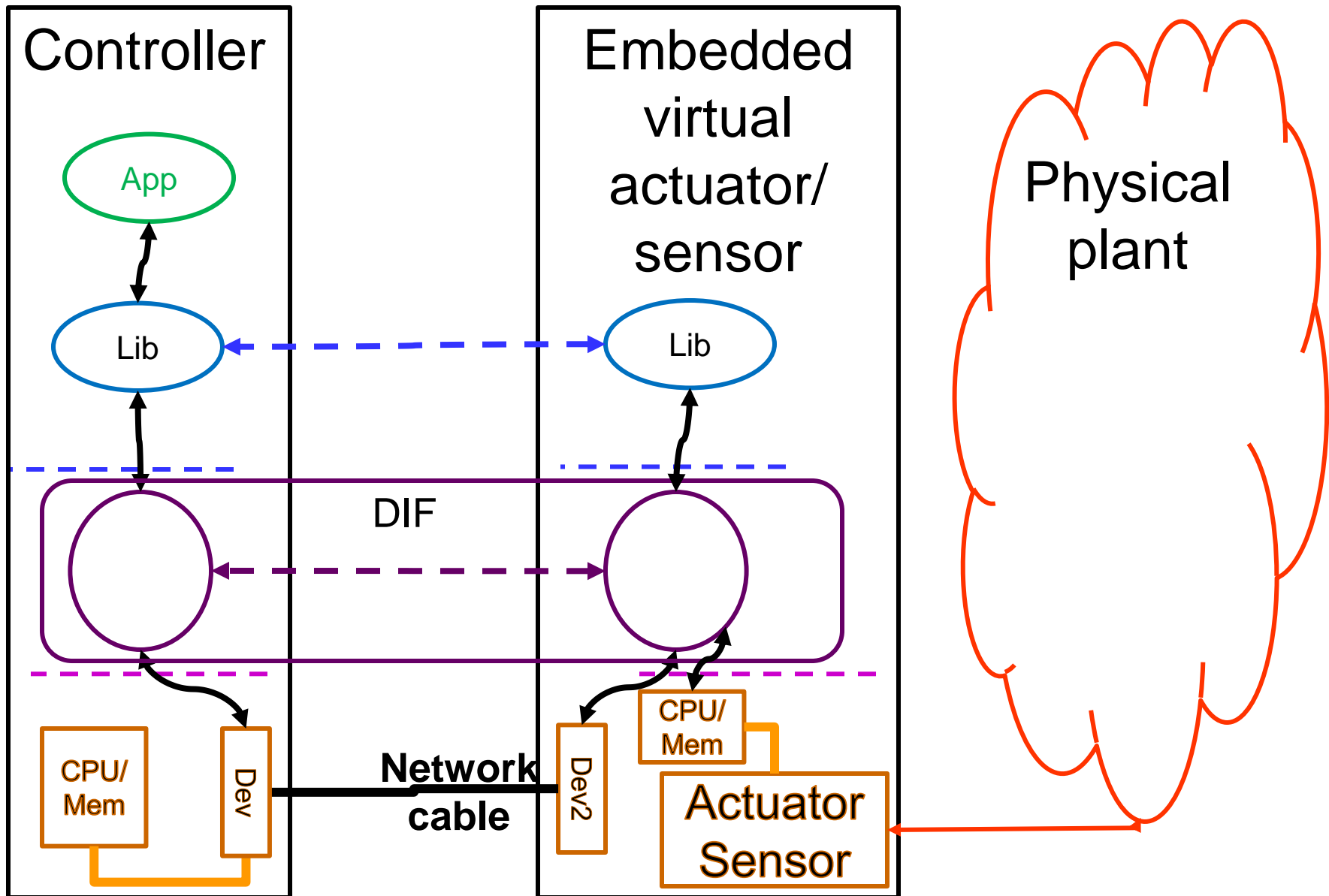
Conjecture: Cells and
brains are RYF but not
gratuitously fragile



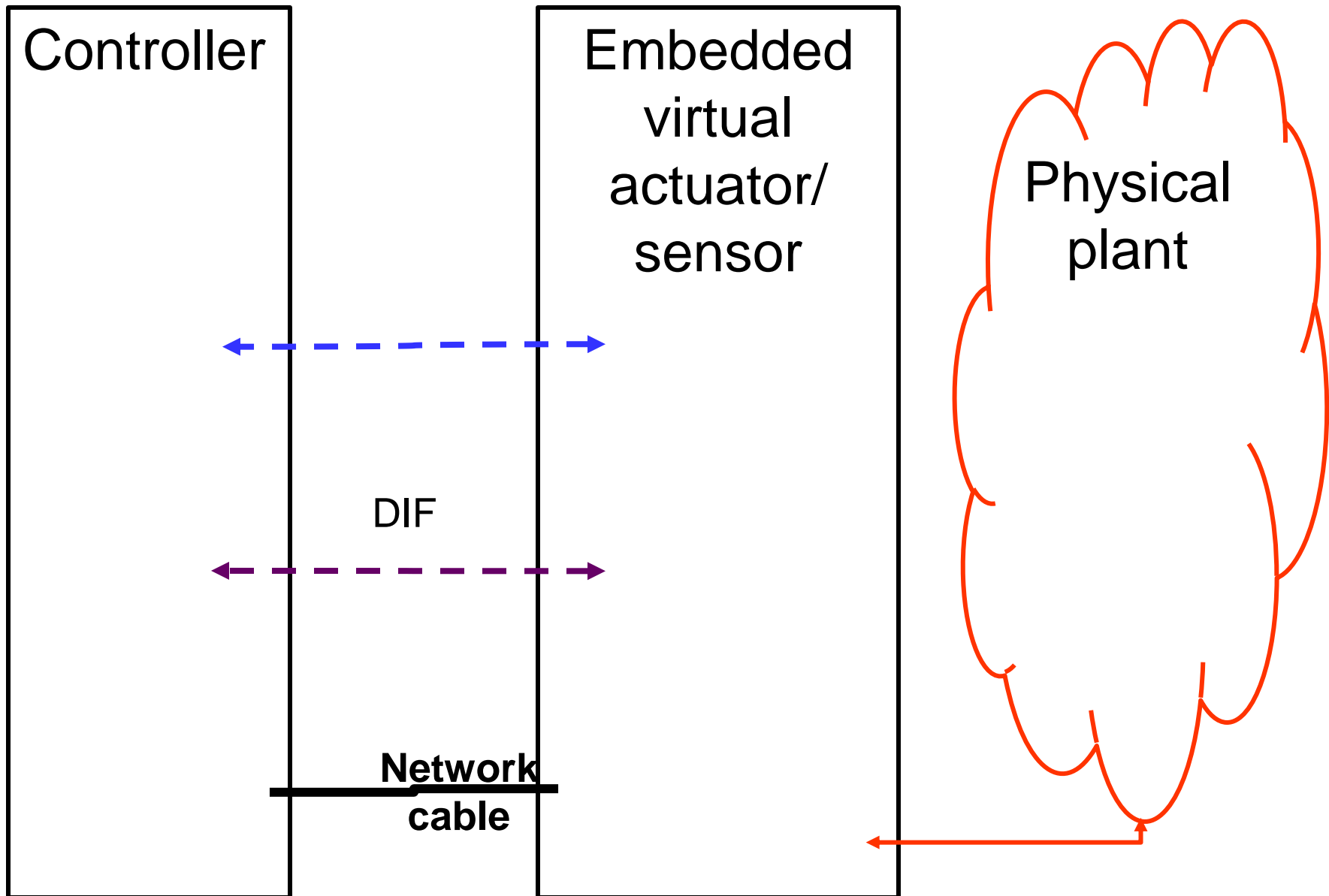
What makes this possible?



Networked embedded



Meta-layering of cyber-phys control



Meta-layers

Cortex

Neurons

Cortex

Neurons

Cortex

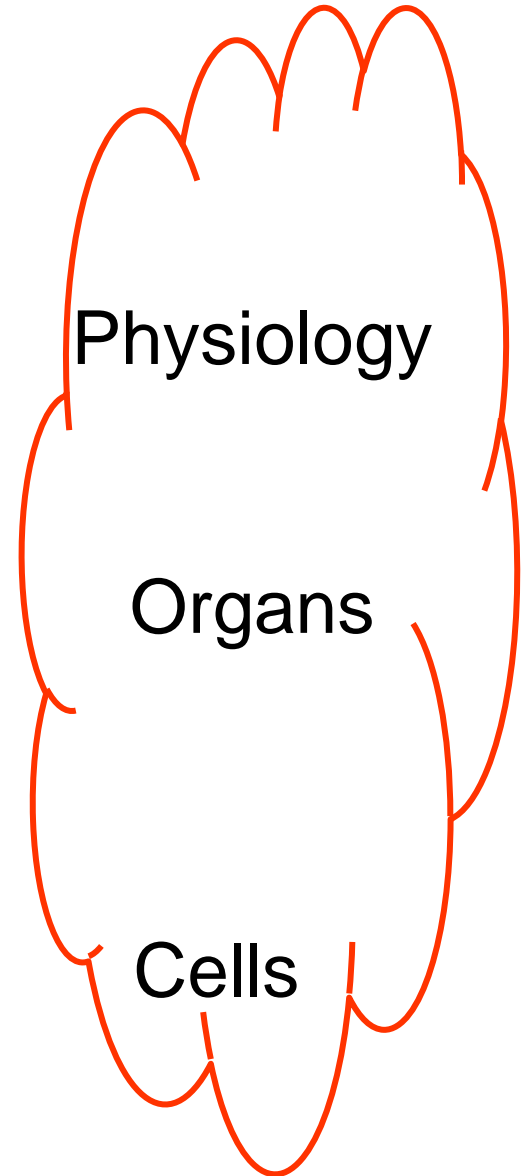
Neurons

Cells

Physiology

Organs

Cells



Meta-layers

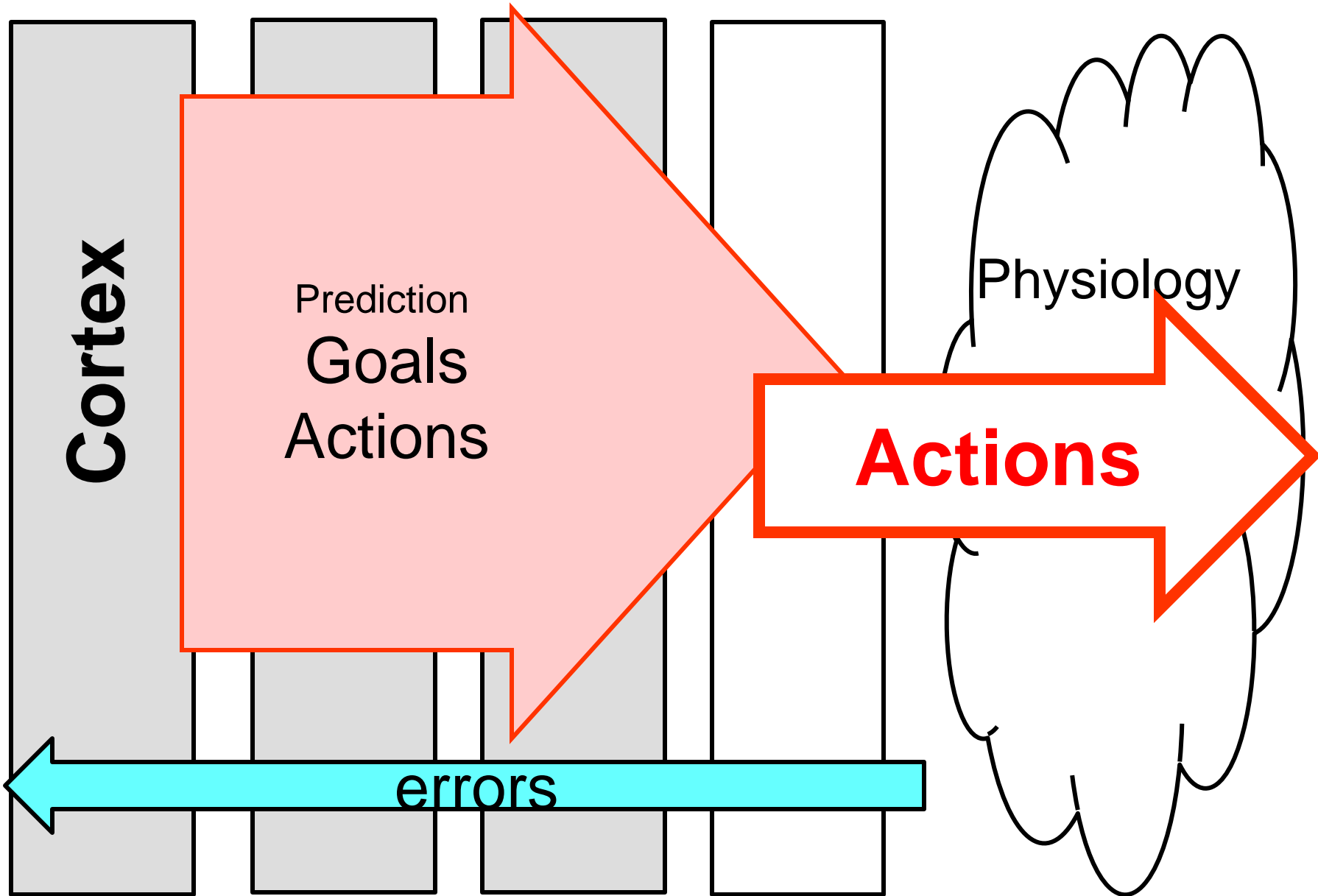
Cortex

Prediction
Goals
Actions

Physiology

Actions

errors



Meta-layers

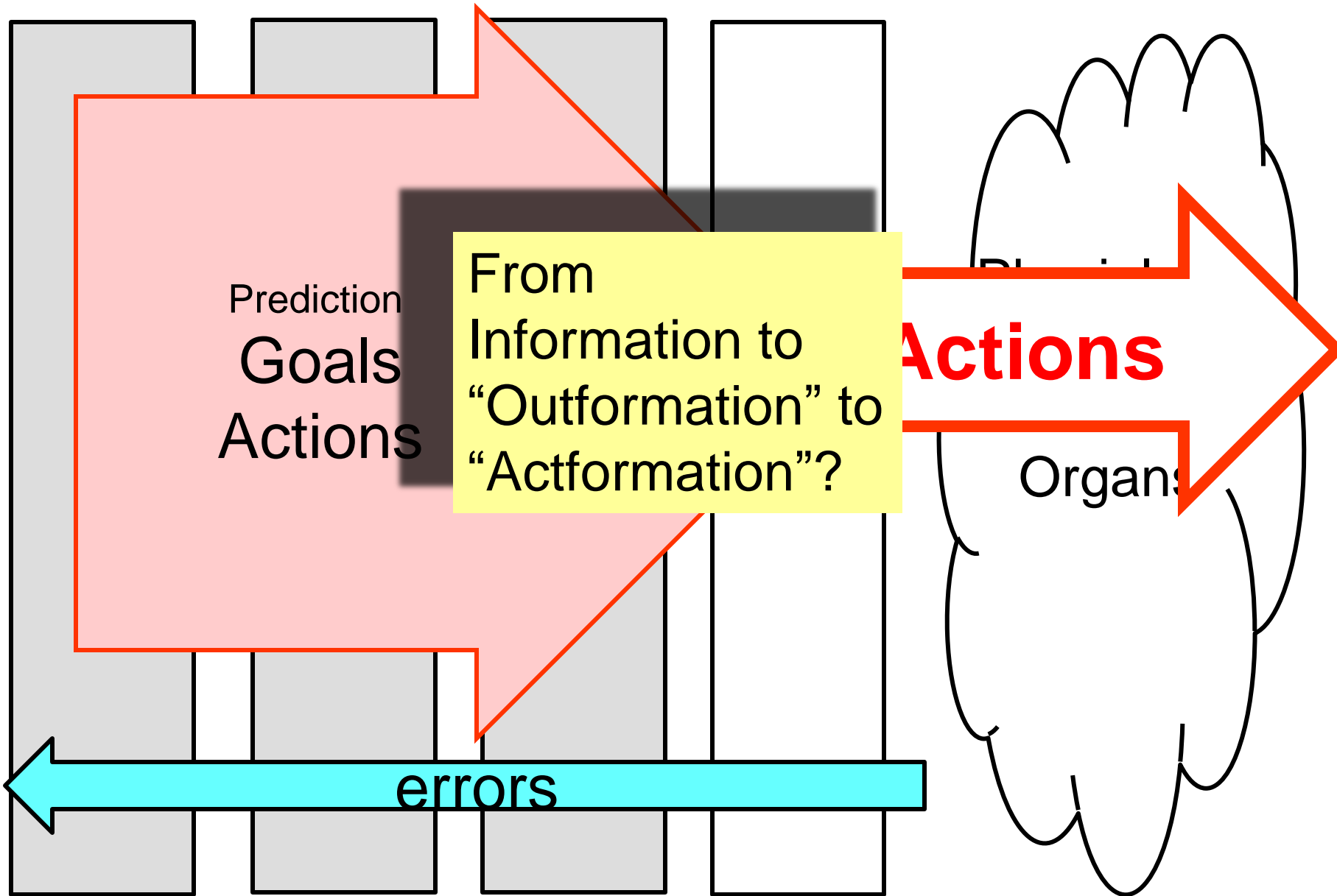
Prediction
Goals
Actions

From
Information to
“Outformation” to
“Actformation”?

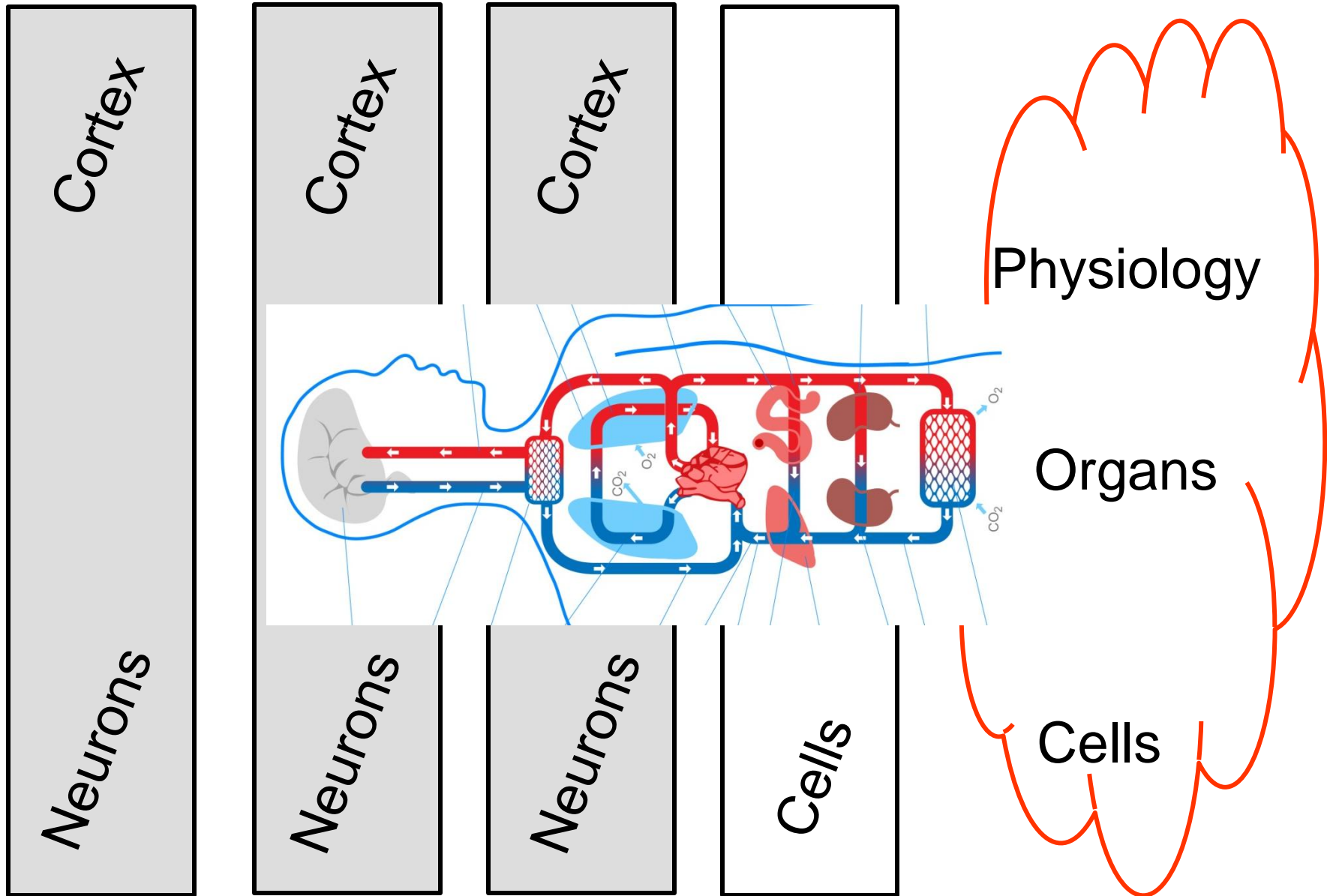
Actions

Organisms

errors



Meta-layers



Minimize
resulting
fluctuations
in

SpO_2

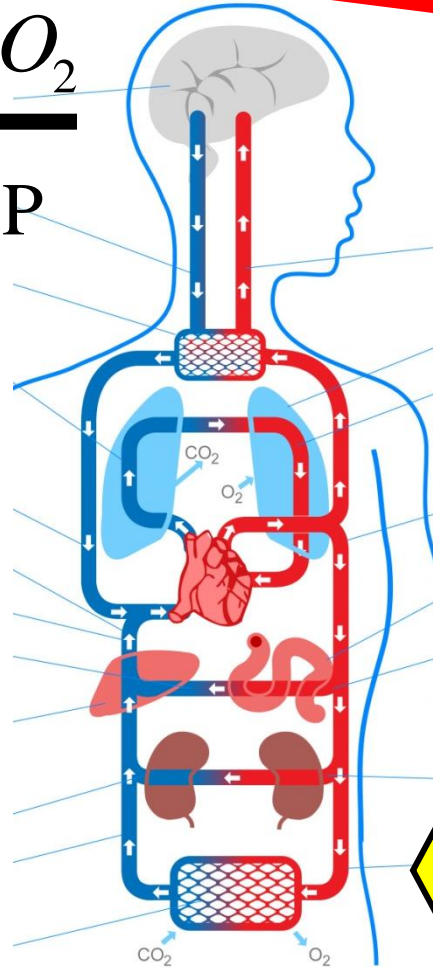
BP

(Evolution +
physiology)

Maximize
allowable
fluctuations
in

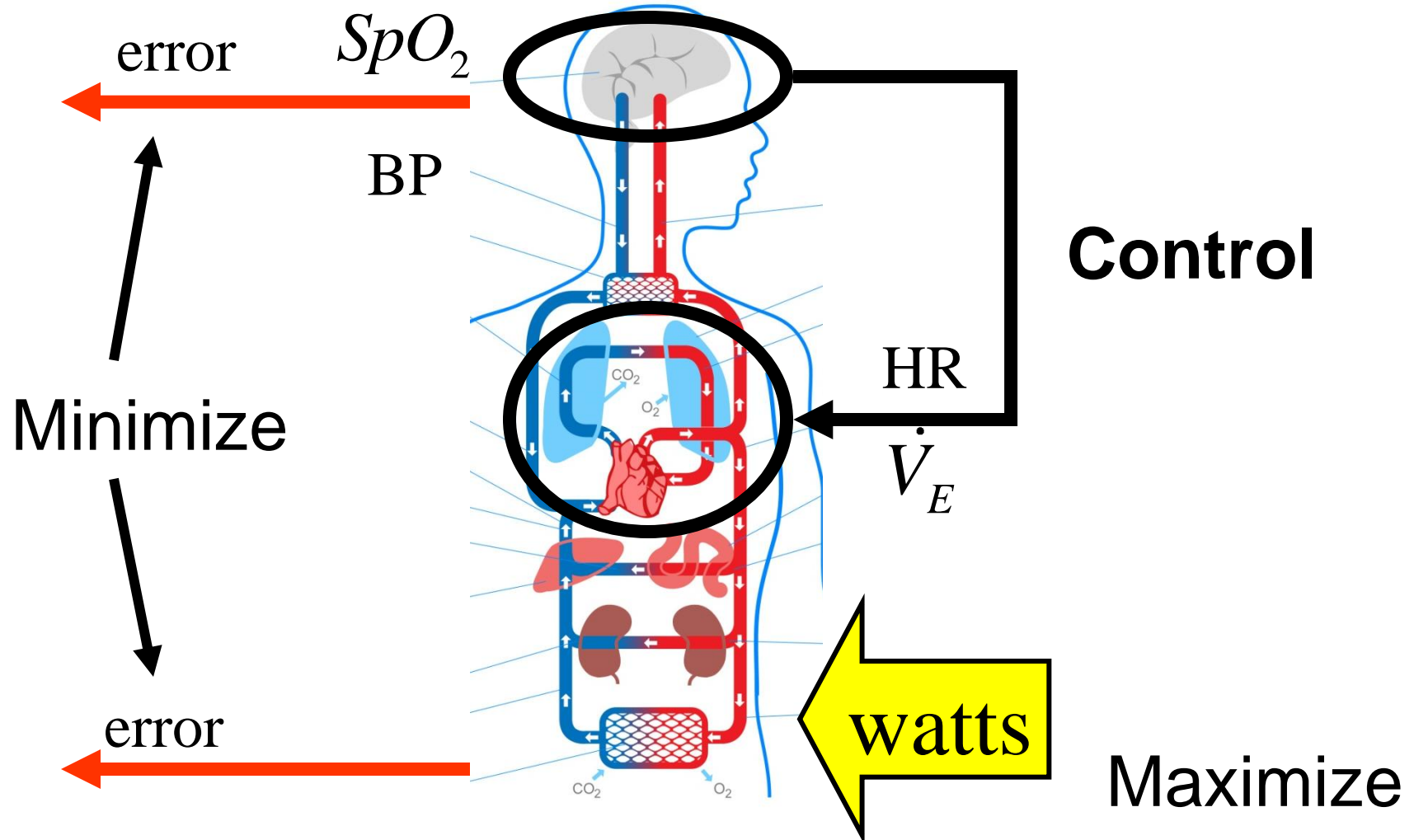
watts

Simple
starting point.



Control requirement

functional requirements



Control
requirement

Finally $\dot{V}O_2$ and $\dot{V}CO_2$ don't need tight control and vary as needed, they don't change as much as watts, but much more than SpO_2 or BP.

